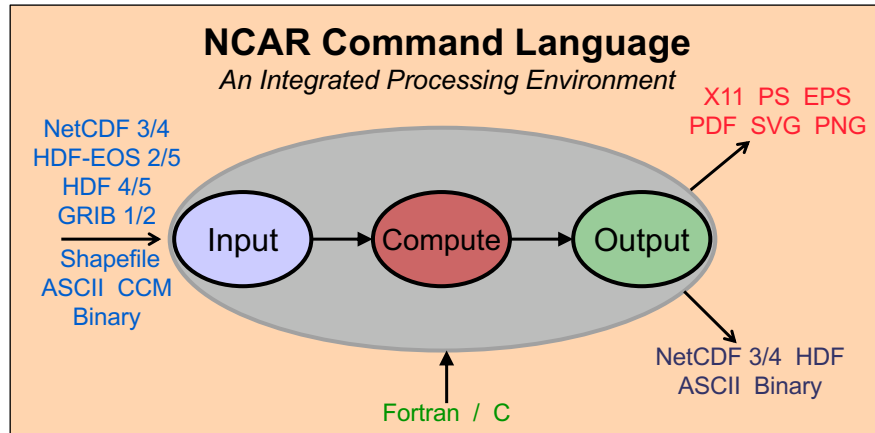
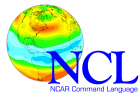


Introduction to NCL Data Analysis



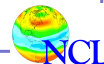
Mary Haley
(with thanks to Dennis Shea)



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Foundation

NCL Data Analysis Outline

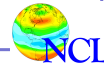
- Goals
- Functions and procedures overview
- Essential utility functions
- Special _Wrap functions / metadata
- WRF functions
- Regridding functions
- Creating your own functions and procedures
- Calling Fortran code from NCL
- Command line arguments
- Programming tips / Clean coding / Best practices



Goals

- Provide general overview
- Introduce most common functions
- Show how to write your own
- Provide **tips**, best practices, links
- Intersperse interactive demos

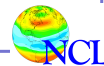
Introduction to NCL Data Analysis



NCL Data Analysis Outline

- Goals
- Functions and procedures overview
- Essential utility functions
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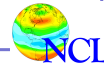
Introduction to NCL Data Analysis



Functions and procedures overview (1 of 2)

- Over 1,400 documented functions and procedures
 - "core"
 - file I/O
 - computational
 - graphics
- Developed with scientific community in mind
- Users have contributed code, bug fixes, suggestions
- Can develop your own - contribute back to NCL!

Introduction to NCL Data Analysis



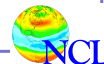
Functions and procedures overview (2 of 2)

- Functions return a value
- Procedures do not return a value
- Two types: built-in and NCL-based
- Organized by type and category
- Every single function documented here:

<http://www.ncl.ucar.edu/Document/Functions/>

Sample categories		
General applied math	ESMF regriding	Meteorology
Bootstrap	Extreme values	Spherical harmonics
Date	Heat stress	Statistics
EOFs	Interpolation	WRF

Introduction to NCL Data Analysis

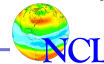


"Built-in" versus "NCL-based"

- Built-in functions are "compiled" into NCL
 - Written in C or Fortran
 - Cannot be easily modified
- NCL-based functions are written in NCL and can be modified

... WRAPIT is
your friend...

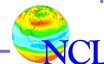
Introduction to NCL Data Analysis



NCL Data Analysis Outline

- Goals
- Functions and procedures overview
- **Essential utility functions**
- Special _Wrap functions / metadata
- WRF functions
- Regridding functions
- Creating your own functions and procedures
- Calling Fortran code from NCL
- Command line arguments
- Programming tips / Clean coding / Best practices

Introduction to NCL Data Analysis



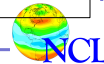
Essential "utility" functions

```
dimsizes
any • all • num
print
printMinMax • printVarSummary
write_matrix
where • mask
conform • conform_dims
dim_xxxx • dim_xxxx_Wrap
dim_xxxx_n • dim_xxxx_n_Wrap
ind
ismissing • default_fillvalue
ndtooned • onedtond • reshape
isatt • isvar
ispan • fspan
sprintfi • sprintf
str_get_cols • str_get_field
```

```
copy_VarMeta • copy_VarAtts
qsort • sqsort
cd_calendar • cd_string
yyyymm_to_yfrac
typeof
system • systemfunc
get_cpu_time • unique_string
new • delete
```

Not an
exhaustive list!

Introduction to NCL Data Analysis



dimsizes

- Returns the dimension sizes of a variable
- For a 1D array, same as the length of the array:

Script

```
x      = (/1,2,3,4,5/)
xlen = dimsizes(x)
print("len = " + xlen)
```

Output

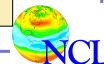
```
(0)      len = 5
```

Tip To get rid of "(0)" output:
ncl -n myscript.ncl

Output

```
len = 5
```

Introduction to NCL Data Analysis



dimsizes – get rank of variable

Script

```
f = addfile("uv300.nc", "r")
v = f->V ; Read V into local variable v
dimv = dimsizes(v)
print(dimv)
rank = dimsizes(dimv)
print ("rank="+rank)
```

Output

```
(0) 2
(1) 64
(2) 128
(0) rank=3
```

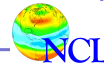
Tip

```
print(str_join(""+dimv, " x "))
```

Output

```
2 x 64 x 128
```

Introduction to NCL Data Analysis



dimsizes / strlen

Script

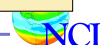
```
strs = ("/January", "February", "March/")
dims = dimsizes(strs)
print(dims)
print(dimsizes(strs(0))) ; not what you think

;---Print length of string
print("len of first str = "+strlen(strs(0)))
```

Output

```
(0) 3
(0) 1
(0) len of first str = 7
```

Introduction to NCL Data Analysis



ispan / yyyymm_time

Returns a 1D array of integers, given start, finish, stride

Script

```
time = ispan(1990,2001,2)
print(time)
```

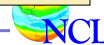
Tip To create YYYYMM array:

```
ym = yyyymm_time(1850,2001,"integer")
print(ym)
```

Output

```
Variable: time
Type: integer
Number of Dimensions: 1
Dimensions and sizes: [6]
(0) 1990
(1) 1992
(2) 1994
(3) 1996
(4) 1998
(5) 2000
```

```
Variable: ym
Type: integer
Dimensions and sizes: [time | 1824]
Coordinates:
          time: [185001..200112]
Number Of Attributes: 2
  long_name : time
   units    : YYYYMM
(0) 185001
(1) 185002
(2) 185003
(3) 185004
. . .
```



ispan / sprinti

Tip If you want "zero-filled" two digit fields:

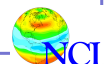
Instead of:

```
smonth = ("/01","02","03",\
          "04","05","06",\
          "07","08","09",\
          "10","11","12"/)
```

Use:

```
imonth = ispan(1,12,1)
smonth = sprinti("%0.2i",imonth)
print(smonth)
```

```
Variable: smonth
Type: string
(0) 01
(1) 02
(2) 03
(3) 04
. . .
(8) 09
(9) 10
(10) 11
(11) 12
```



fspan / sprintf

Returns a 1D array of floats or doubles, given start, end, # points

Script

```
xflt = fspan(-89.125, 9.3, 100)
xdbl = fspan(-89.125, 9.3d, 100)

print(xflt)
print(xdbl)
```

Tip "Pretty-print"

```
print(sprintf("%7.3f", xflt))
```

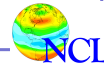
Output

```
Variable: xflt
Type: float
(0) -89.125
(1) -88.13081
(2) -87.13662
. . .
(97) 7.311616
(98) 8.305808
(99) 9.3
```

```
Variable: xdbl
Type: double
(0) -89.125
(1) -88.13080808080808
(2) -87.1366161616161
. . .
(97) 7.311616161616158
(98) 8.305808080808077
(99) 9.30000000000001
```

```
(0) -89.125
(1) -88.131
(2) -87.137
(3) -86.142
. . .
(78) -11.578
(79) -10.584
(80) -9.590
(81) -8.595
. . .
```

Introduction to NCL Data Analysis



any / all / num

Testing and counting array values

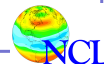
Snippets

```
If (any(x.lt.0)) then
  print("Error: all values must be > 0")
end if
```

```
maxlat = 30.5
if (all(lat.ge.maxlat)) then
  print("Warning: all your lat values are > " + maxlat)
end if
```

```
min_temp = 0
max_temp = 100
count = num(temp.ge.min_temp.and.temp.le.max_temp)
print("There are " + count + " values in the range " + \
      min_temp + " to " + max_temp)
```

Introduction to NCL Data Analysis



ismissing

Essential function for testing for missing values

Script

```
x = (/ 1, 2, -99, 4, -99, -99, 7 /)
print(ismissing(x))
```

Output

```
(0) False
(1) False
(2) False
(3) False
(4) False
(5) False
(6) False
```

Script

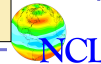
```
x = (/ 1, 2, -99, 4, -99, -99, 7 /)
print(ismissing(x))

x@_FillValue = -99
print(ismissing(x))
```

Output

```
(0) False
(1) False
(2) True
(3) False
(4) True
(5) True
(6) False
```

Introduction to NCL Data Analysis



ismissing: use with any/all/num

```
If(any(ismissing(x)) then
  print("Warning: x contains one or more missing values.")
else
  . . .
end if
```

```
if(all(ismissing(lat)) then
  print("Error: all your lat values are missing!")
  exit
end if
```

```
num_msg = num(ismissing(temp))
num_valid = num(.not.ismissing(temp))
print("temp contains " + num_msg + " missing values.")
print("temp contains " + num_valid + " valid values. ")
```

Tip

```
if(.not.isatt(x, "_FillValue")) then
  x@_FillValue = default_fillvalue(typeof(x))
end if
```

Introduction to NCL Data Analysis



Do NOT test for missing values using actual values!

No:

```
if(any(x.eq.-999)) then
  print("Error: x cannot contain missing values.")
end if
```

Tip

Yes:

```
If(any(ismissing(x)) then
  print("Error: x cannot contain missing values.")
end if
```

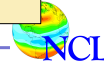
No:

```
if(all(x.eq.x@_FillValue)) then
  print("Warning: all your x values are missing!")
end if
```

Yes!

```
if(all(ismissing(x))) then
  print("Warning: all your x values are missing!")
end if
```

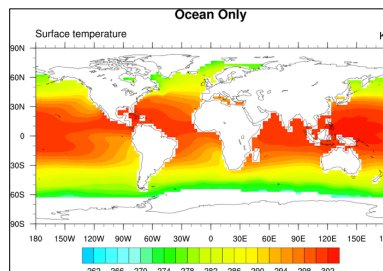
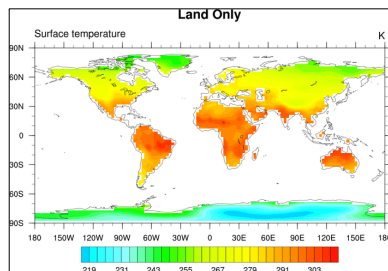
Introduction to NCL Data Analysis



mask

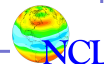
- Mask data array based on some condition
- First two arguments must be same dimensionality

```
in = addfile("atmos.nc","r")
ts = in->TS(0,::)
oro = in->ORO(0,::) ; ocean=0, land=1, sea_ice=2
tsl = mask(ts,oro,1) ; mask ocean
tso = mask(ts,oro,0) ; mask land
```



<http://www.ncl.ucar.edu/Applications/mask.shtml>

Introduction to NCL Data Analysis



where

Performs array assignments based upon a conditional array

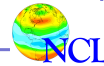
```
;---Add 256 to all values in q < 0.0  
q = where(q .lt. 0, q+256, q)
```

```
x = where (T.ge.0 .and. ismissing(Z), a+25, 1.8*b)  
ts = where (oro.eq.1, ts, ts@_FillValue)  
salinity = where (sst.lt.5 .and. ice.gt.icemax, \  
                salinity*0.9, salinity)
```

Tip No
y = **where**(y.eq.0, y@_FillValue, 1./y)

Yes
y = 1.0/**where**(y.eq.0, y@_FillValue, y)

Introduction to NCL Data Analysis



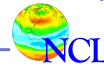
Demos
any, all, num, ismissing
mask, where

dim_xxx and dim_xxx_n

- Performs common operations on given dimensions
- `dim_xxx` operates across rightmost dimension ONLY
- `dim_xxx_n` allows you to specify dimension(s), uses much less memory, cleaner code!
- `dim_avg_n` (*stddev, sum, sort, median, rmsd, ...*) (20+)
- Still okay to use original `dim_xxxx` functions if don't need to reorder!

<http://www.ncl.ucar.edu/Document/Functions/math.shtml>

Introduction to NCL Data Analysis



dim_xxx and dim_xxx_n

Assume you have 3D array, `z(time x lat x lon)`

```
;---To average across longitude (zonal) no reordering required
zAvgZon = dim_avg(z) ; → zAvgZon(ntim,nlat)
```

This also works, but makes no difference in memory or timing

```
zAvgZon = dim_avg_n(z,2) ; → zAvgZon(ntim,nlat)
```

Works, but can be slow and memory intensive

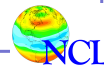
```
;---To average across time, reordering required
zAvgTime = dim_avg(z(lat|:,lon|:,time|:)) ; → zAvgTime(nlat,nlon)
```

Faster, cleaner, and less memory intensive

```
zAvgTime = dim_avg_n(z,0) ; → zAvgTime(nlat,nlon)
```

<http://www.ncl.ucar.edu/Document/Functions/math.shtml>

Introduction to NCL Data Analysis



Demo

dim_avg, dim_avg_n

conform / conform_dims

- Conform smaller array to size of larger array
- Smaller array must be scalar or subset in size of larger array

```
;---Assume x(nlat,m lon), wgt(nlat)
wx = conform(x, wgt, 0) ; wx(nlat,m lon)
```

```
wx = conform_dims(dimsizes(x),wgt,0) ; identical
```

Script

```
x = ((/1,2,3/), (/4,5,6/)) ; x(2,3)
y = (/7,8,9/) ; y(3)
z = conform(x,y,1)
opt = True Tip ; print matrix
opt@title="x (2 x 3)"
write_matrix(x, "3i3", opt)
opt@title="z (2 x 3)"
write_matrix(z, "3i3", opt)
```

Output

```
x (2 x 3)
 1  2  3
 4  5  6

z (2 x 3)
 7  8  9
 7  8  9
```

ind

- Returns indexes where condition is True
- Operates on 1D array only

Script

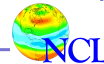
```
;           0   1   2   3   4   5   6   7   8
year = (/1990,1986,2011,1776,1923,2018,1800,1953,1965/)
print(ind(year.ge.2000))
print(ind(year.ge.1900.and.year.le.1999))
print(ind(year.eq.0))
```

Output

```
(0)  2
(1)  5
```

```
(0)  0
(1)  1
(2)  4
(3)  7
(4)  8
```

```
(0)  -2147483647
(default missing value for
an integer)
```



ind

Can use indexes in array operations

Script

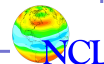
```
year = (/1990,1986,2011,1776,1923,2018,1800,1953,1965/)
xavg = (/ 50 , 61 , 32 , 40 , 55 , 42 , 65 , 18 , 0 /)
ii = ind(year.ge.2000)
jj = ind(year.ge.1900.and.year.le.1999)
kk = ind(year.eq.0)
print(ii + " / " + year(ii) + " / " + xavg(ii))
print(jj + " / " + year(jj) + " / " + xavg(jj))
print(xavg(kk) ; What will happen?)
```

Output

```
(0)  2 / 2011 / 32
(1)  5 / 2018 / 42
```

```
(0)  0 / 1990 / 50
(1)  1 / 1986 / 61
(2)  4 / 1923 / 55
(3)  7 / 1953 / 18
(4)  8 / 1965 / 0
```

```
???
```



ind / ndtooned / onedtond

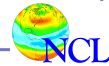
Can use on nD arrays, but need to convert to 1D

```
; let q and x be nD arrays
q1D    = ndtooned (q)
x1D    = ndtooned (x)
ii     = ind(q1D.gt.0. .and. q1D.lt.5)
jj     = ind(q1D.gt.25)
kk     = ind(q1D.lt. -50)
x1D(ii) = sqrt( q1D(ii) )
x1D(jj) = 72
x1D(kk) = -x1D(kk)*3.14159
x      = onedtond(x1D, dimsizes(x))
```

Tip

```
x = where (q.gt.0.and.q.lt.5, sqrt(q), x)
x = where (q.gt.25, 72, x)
x = where (q.lt.-50, -x*3.14159, x)
```

Introduction to NCL Data Analysis



Demos
ind
conform / conform_dims

Many date conversion functions

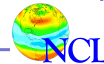
- `cd_calendar` / `cd_inv_calendar`
- `cd_string` / `yyyymm_to_yyyyfrac`

```
time (/ 17522904, 17522928, 17522952 /)
time@units = "hours since 1-1-1 00:00:0.0"
date1 = cd_calendar(time, 0)
date2 = cd_calendar(time, -2)
print(date1)
print(date2)
```

date1		date2	
(0,0)	2000	(2,0)	2000
(0,1)	1	(2,1)	1
(0,2)	1	(2,2)	3
(0,3)	0	(2,3)	0
(0,4)	0	(2,4)	0
(0,5)	0	(2,5)	0

<http://www.ncl.ucar.edu/Document/Functions/date.shtml>

Introduction to NCL Data Analysis

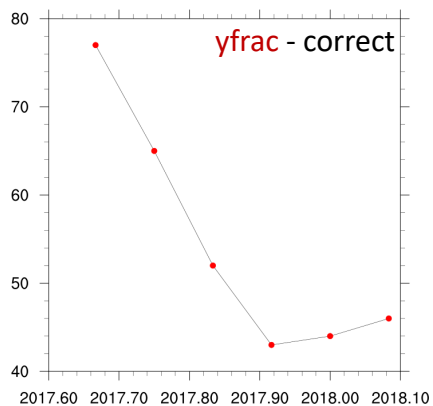
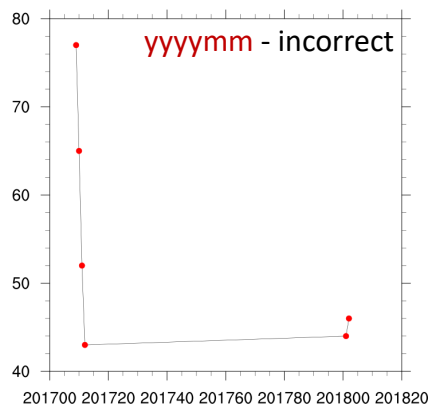


Date functions are crucial for plotting

```
yyyymm = (/201709,201710,201711,201712,201801,201802/)
temp = (/ 77 , 65 , 52 , 43 , 44 , 46 /)

wks = gsn_open_wks ("x11","xy")
plot = gsn_csm_xy (wks,yyyymm,temp,False) ; Incorrect

yfrac = yyyymm_to_yyyyfrac(yyyymm,0.)
plot = gsn_csm_xy (wks,yfrac,temp,False) ; Correct
```

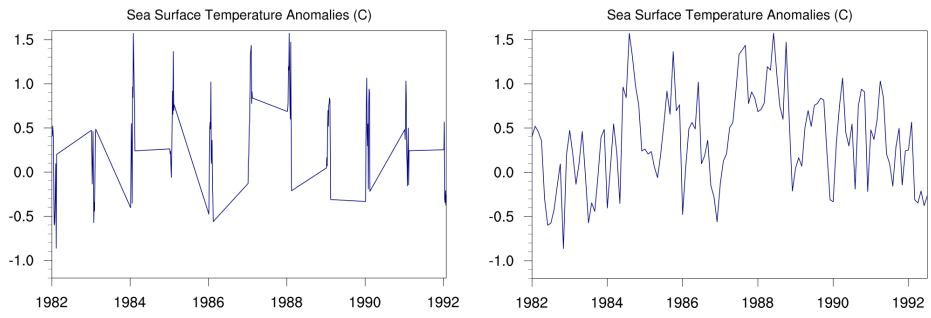


New Slide

```
a = addfile("sst8292a.nc","r")
sst = a->SSTA ; time (127) x lat x lon
yyyyymm = a->date ; 198201, 198202, . . .
yfrac = yyyyymm_to_yyyyfrac(yyyyymm,0) ; 1982, 1982.083

;---Bad plot
plot = gsn_csm_xy(wks, yyyyymm, sst(:,{0},{0}), res)

;---Good plot
plot = gsn_csm_xy(wks, yfrac, sst(:,{0},{0}), res)
```



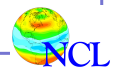
String functions

- Splitting data from a CSV file
- Parsing complicated strings
- Formatting numeric values to write to ASCII file
- Finding matching strings

<code>str_get_cols</code>	<code>str_split_csv</code>
<code>str_get_field</code>	<code>sprintf</code>
<code>str_join</code>	<code>sprintf</code>
<code>str_match</code>	<code>strlen</code>
<code>str_strip</code>	<code>unique_string</code>
<code>str_split</code>	

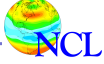
Useful for reading ASCII or CSV files.

<http://www.ncl.ucar.edu/Document/Functions/string.shtml>



Parsing strings, converting to float/int

Script	<pre>x = ("/u_052134_C ", " q_1234_C ", "temp_72.55_C"/)</pre>		
	<pre>f1 = str_get_field(x, 1, "_") f2 = str_get_field(x, 2, "_") print("f1='" + f1+ "'") print("f2='" + f2+ "'")</pre>		
	<pre>col = str_get_cols(x, 2, 4) print("col='" + col + "'")</pre>		
	<pre>N = toint(str_get_cols(x(0), 3, 7)) T = tofloat(str_get_cols(x(2), 5,9)) print("N = " + N) print("T = " + T)</pre>		
Output	<pre>(0) f1='u' (1) f1=' q' (2) f1='temp' (0) f2='052134' (1) f2='1234' (2) f2='72.55'</pre>	<pre>(0) col='052' (1) col='_12' (2) col='mp_'</pre>	<pre>(0) N = 52134 (0) T = 72.55</pre>

Introduction to NCL Data Analysis 

system / systemfunc

- Execute UNIX commands from NCL (bash shell)
- Useful for returning a list of files, removing a file, etc

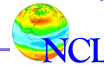
```
system ("convert foo.eps foo.png ; rm foo.eps") ; multiple cmds
system ("ncrcat -v T,Q foo*.nc FOO.nc")
system ("rm -f " + file_name)
```

```
files = systemfunc("ls wrfout*") ; list of files
files = systemfunc("cd /some/directory ; ls foo*.nc")
UTC = systemfunc("date") ; UNIX date
date = systemfunc("date +%a %m%d%y %H%M' ") ; single quote
City = systemfunc("cut -c100-108 " + fname)
```

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- **Special _Wrap functions / metadata**
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- Programming tips / Clean coding / Best practices

Introduction to NCL Data Analysis



Handling metadata

- Computations can cause loss of metadata

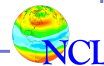
```
y = x           ; x is exact copy of y  
T = T + 273     ; T retains its metadata  
z = 5 * x       ; z will have no metadata
```

- Built-in functions also cause metadata loss

```
Tavg = dim_avg_n(T,0)  
s     = sqrt(u^2 + v^2)
```

- Some exceptions: `vinth2p`

Introduction to NCL Data Analysis



Ways to retain metadata (1 of 3)

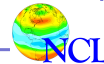
- Use special "wrapper" functions

```
dim_avg_n_Wrap
dim_variance_n_Wrap
g2gsh_Wrap
int2p_Wrap
smth9_Wrap
wgt_runave_Wrap
. . .
```

- Takes same arguments as the non-Wrap versions

```
f = addfile("dummy.nc", "r")
x = f->x
xZon = dim_avg_n(x, 3)           ; xZon will NOT have metadata
xZon = dim_avg_n_Wrap(x, 3)     ; xZon will have metadata
```

Introduction to NCL Data Analysis



Ways to retain metadata (2 of 3)

Use copy_XXXX functions

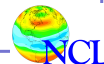
```
copy_VarMeta   (attributes + coordinate arrays)
copy_VarAtts   (attributes only)
copy_VarCoords (coordinate arrays only)
```

```
f = addfile("dummy.nc", "r")
x = f->x           ; x(time,lev,lat,lon)

;---calculation
xZon = dim_avg_n(x, 2) ; xZon

;---copy meta data
copy_VarMeta(x, xZon) ; xZon(time,lat)
```

Introduction to NCL Data Analysis



Ways to retain metadata (3 of 3)

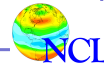
- Use variable-to-variable copy
- Make sure to use variable with correct metadata!
- Might need to correct some metadata (long_name, units)

```
f = addfile("dummy.nc", "r")
x = f->X ; x(time,lev,lat,lon)

;---variable-to-variable copy & dimension reduction
xZon = x(:, :, :, 0) ; xZon(time,lev,lat)

;---calculation
xZon = dim_avg_n(x, 0)
xZon@op = "Zonal Avg: " + x@long_name
```

Introduction to NCL Data Analysis



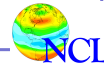
Demo

`dim_avg_n_Wrap`, metadata

NCL Data Analysis Outline

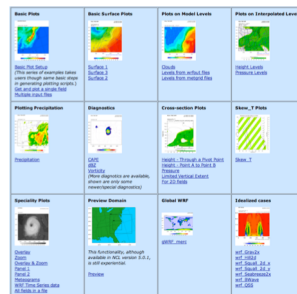
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Introduction to NCL Data Analysis



WRF functions (`wrf_XXXX`)

- Weather and Research Forecast Model
- Computational and plotting functions developed by NCAR/MMM
- `wrf_user_getvar` gets diagnostics
- MMM has their own NCL/WRF web page



<http://www.mmm.ucar.edu/wrf/OnLineTutorial/Graphics/NCL/>

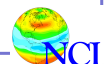
- Python version available! **wrf-python**

<http://wrf-python.readthedocs.io/en/latest/>

<http://www.ncl.ucar.edu/Applications/wrf.shtml>

<http://www.ncl.ucar.edu/Applications/wrfdebug.shtml>

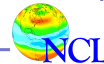
Introduction to NCL Data Analysis



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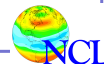
Introduction to NCL Data Analysis



Regridding overview

- Many regridding / interpolation functions available
- Spatial (lat,lon) and vertical (pressure,height)
- In general, ESMF is best spatial regridding suite to use
<http://www.ncl.ucar.edu/Applications/ESMF.shtml>
- Must know your data to know which is best
 - rectilinear
 - curvilinear
 - unstructured (mesh)
 - random points
- Documentation for all regridding and interpolation functions:
<http://www.ncl.ucar.edu/Document/Functions/regrid.shtml>
<http://www.ncl.ucar.edu/Document/Functions/interp.shtml>

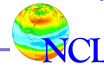
Introduction to NCL Data Analysis



Common (spatial) grids and meshes

- Rectilinear – data with coordinate arrays
 - 1x2, 2x3, gaussian, Finite Volume (FV), Global Reanalysis
 - $x(\dots, \text{lat}, \text{lon}) \rightarrow \text{lat}(\text{lat})$ and $\text{lon}(\text{lon})$
- Curvilinear – data with 2D lat/lon arrays
 - WRF, POP, GODAS, RegCM, NARR, Satellite
 - $x(\dots, \text{nlat}, \text{mlon}) \rightarrow \text{lat2d}(\text{nlat}, \text{mlon})$ and $\text{lon2d}(\text{nlat}, \text{mlon})$
- Unstructured (mesh or random)
 - Spectral Element (SE), Finite Element (FE), MPAS, ICON
 - $x(\dots, \text{ncells}) \rightarrow \text{lat}(\text{ncells})$ and $\text{lon}(\text{ncells})$

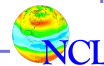
Introduction to NCL Data Analysis



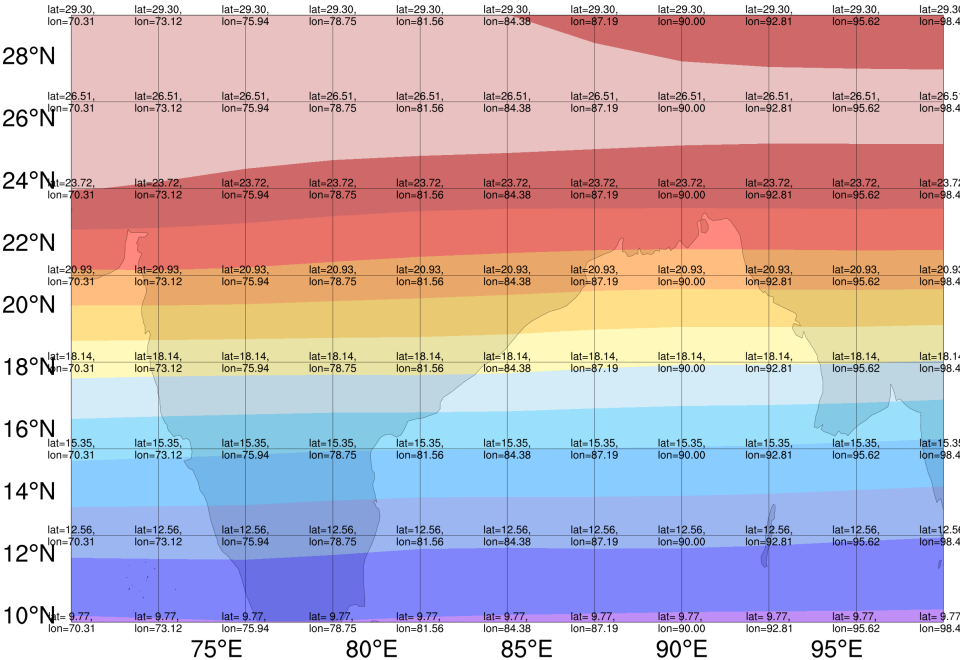
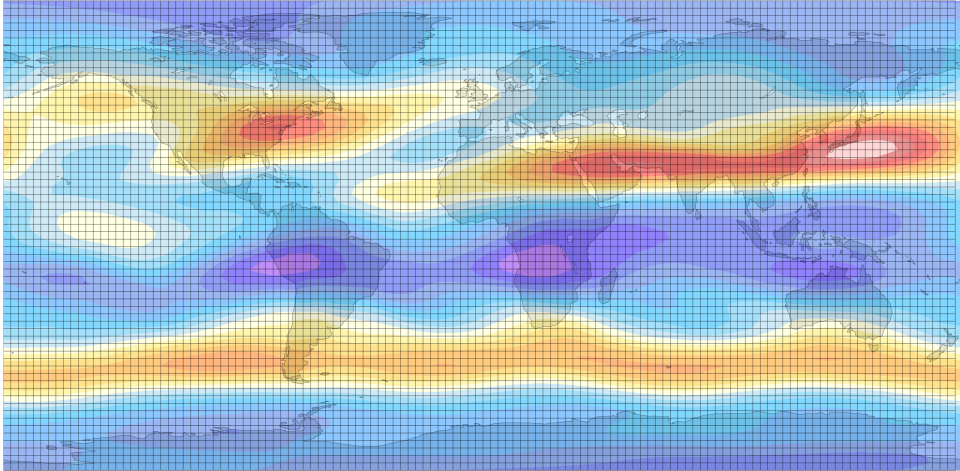
Why different grids?

- Advances in computer architecture
- Computational efficiency
- Addresses pole singularities
- Better representation for physics and/or dynamical core

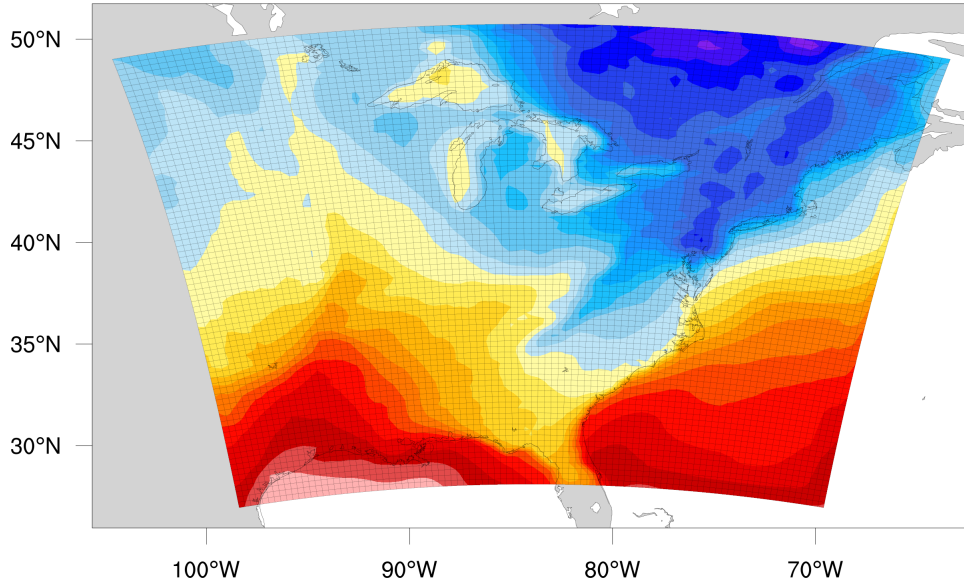
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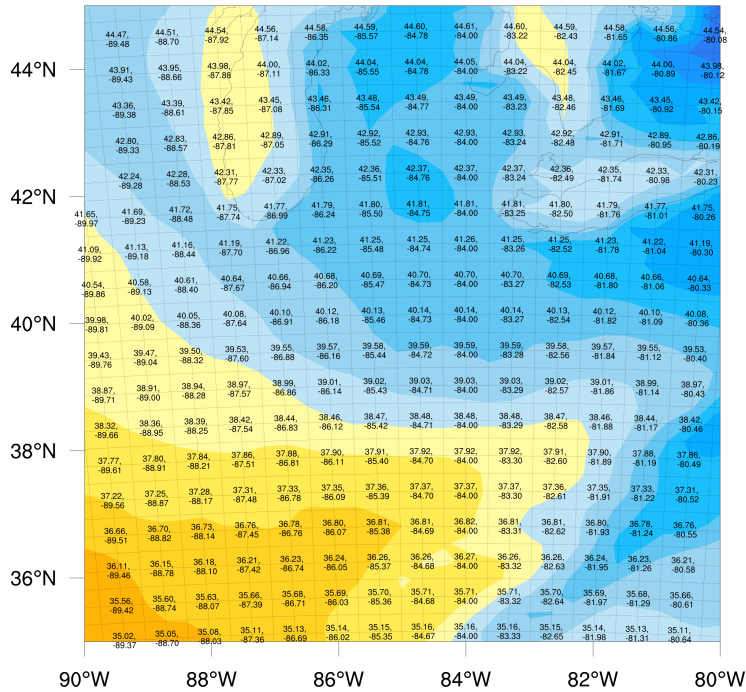
Rectilinear grid (64 x 128)



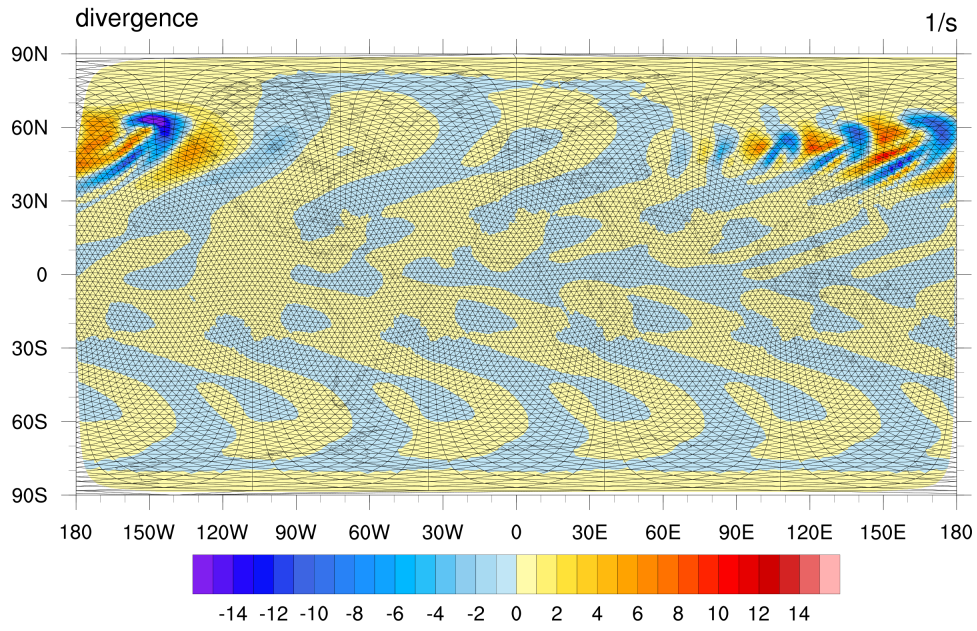
Curvilinear WRF lat/lon grid: 83 x 97



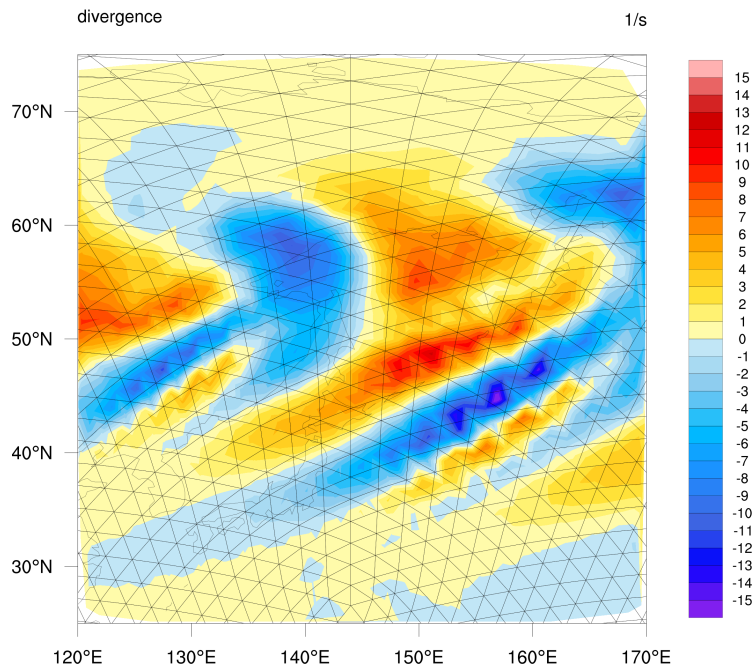
Curvilinear WRF lat/lon grid: 83 x 97



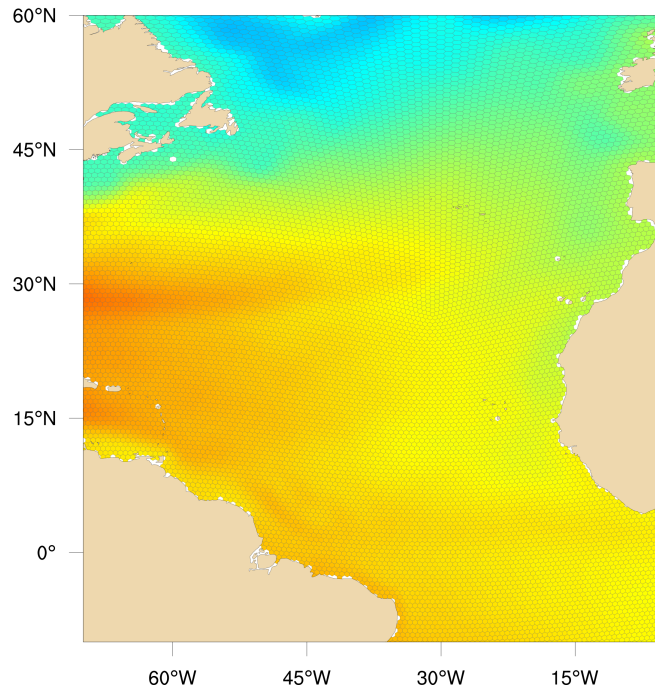
ICON model: 20480 triangles



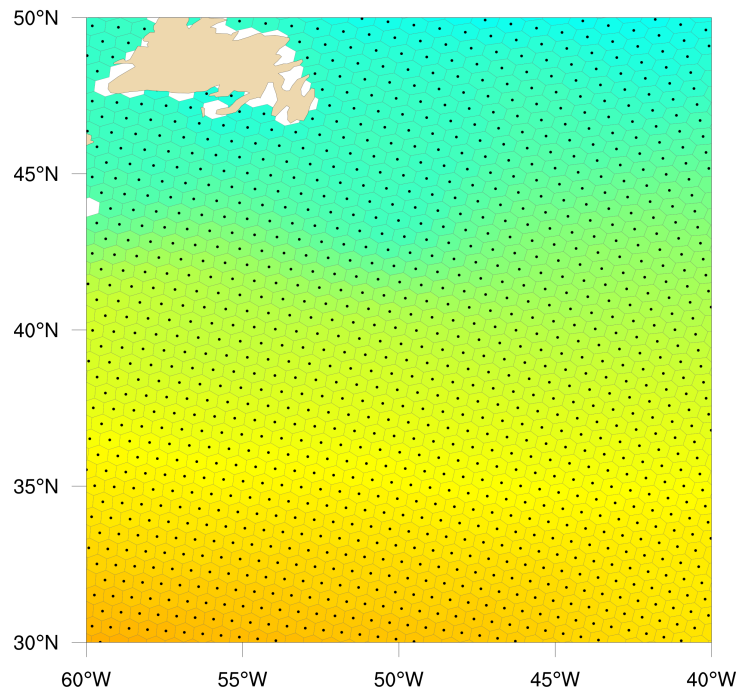
ICON model: 20480 triangles



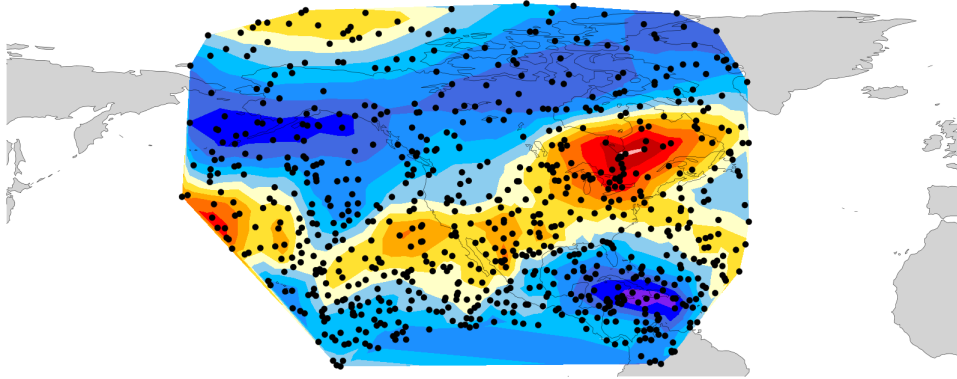
MPAS unstructured mesh: 114540 cells



MPAS unstructured mesh: 114540 cells



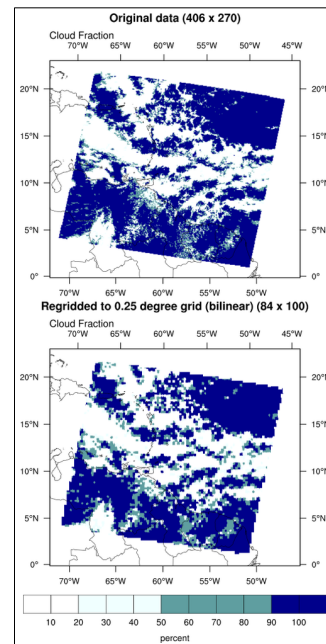
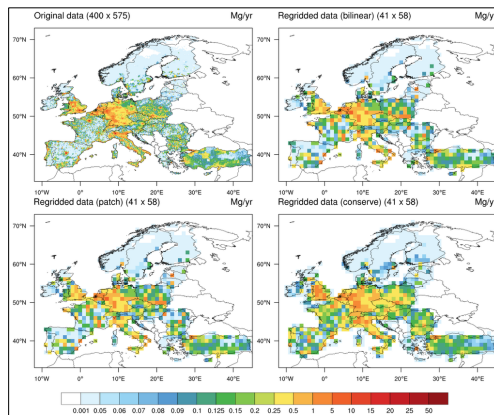
Random points



ESMF Regridding



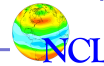
<http://www.earthsystemmodeling.org/>



ESMF regridding comments (1 of 3)

- Integrated in conjunction with NOAA / CIRES
- Works with rectilinear, curvilinear, unstructured grids and meshes
- **CREATES A WEIGHTS FILE (NetCDF file)**
- Multiple interpolation methods available
 - Bilinear
 - Conservative
 - Patch
 - Nearest neighbor
- Can handle masked points
- Better treatment for values at poles
- Works on global/regional grids

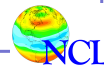
Introduction to NCL Data Analysis



ESMF regridding comments (2 of 3)

- "Source grid" – the grid/mesh you are starting with
- "Destination grid" – the grid/mesh you want to regrid to
- For both source / destination lat/lon, must know:
 - Global or regional?
 - Rectilinear, curvilinear, unstructured, random?
 - Have missing values?
 - Is it a smooth field (temperature) or not (precipitation)?

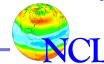
Introduction to NCL Data Analysis



ESMF regridding comments (3 of 3)

- Must create a weights file for every grid / mesh that has different lat/lon values or different location of missing values
- Once you have weights file, you can use it to regrid;
MUCH FASTER!
- Be careful with regridding U/V quantities
- ESMF examples page is extensive
<http://www.ncl.ucar.edu/Applications/ESMF.shtml>

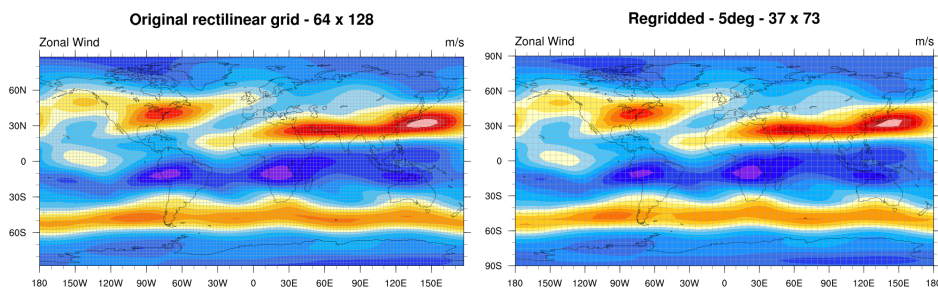
Introduction to NCL Data Analysis



Regridding rectilinear variable to 5 degree

```
load "$NCARG_ROOT/lib/ncarg/nclscripts/esmf/ESMF_regridding.ncl"
f = addfile("uv300.nc","r")      ; Open file
u = f->U(0, :, :)                ; Read first time step

opt                               = True          ; Set regridding options
opt@DstGridType = "5deg"          ; Set destination grid
opt@WgtFileName = "rect_to_5deg.nc"
u_regrid = ESMF_regrid(u,opt)     ; Regrid u (and create
                                   ; weights file)
```

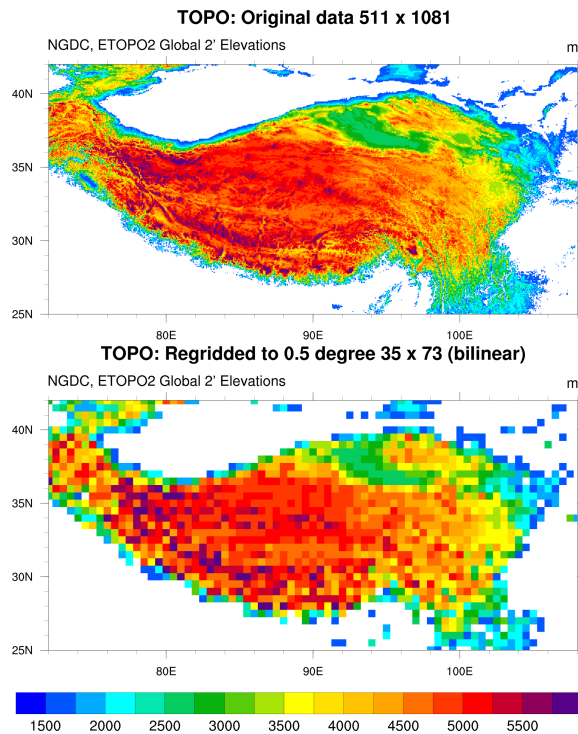
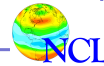


ESMF Regridding – using weights file

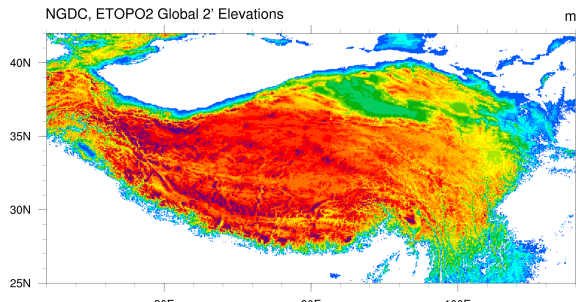
- Slow part is creating weights file
- Use `ESMF_regrid_with_weights` once you have file

```
load "$NCARG_ROOT/lib/ncarg/nclscripts/esmf/ESMF_regridding.ncl"  
  
f = addfile("uv300.nc","r")      ; Open file  
u = f->U(0,::)                  ; Read first time step  
  
wgts_file = "rect_to_5deg.nc"  
u_regrid = ESMF_regrid_with_weights(u,wgts_file,False)
```

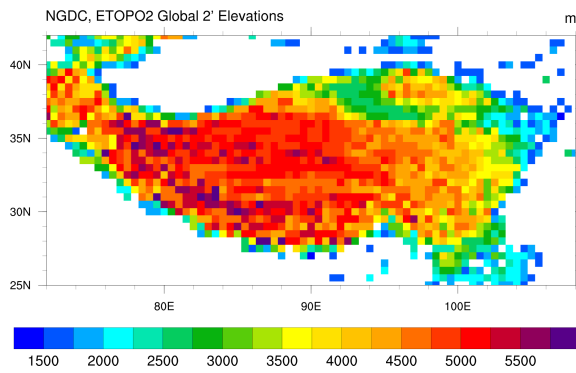
Introduction to NCL Data Analysis



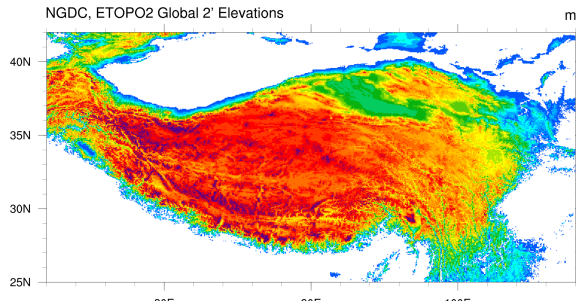
TOPO: Original data 511 x 1081



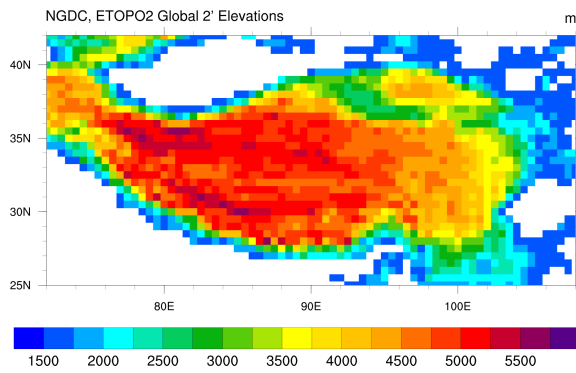
TOPO: Regridded to 0.5 degree 35 x 73 (patch)



TOPO: Original data 511 x 1081

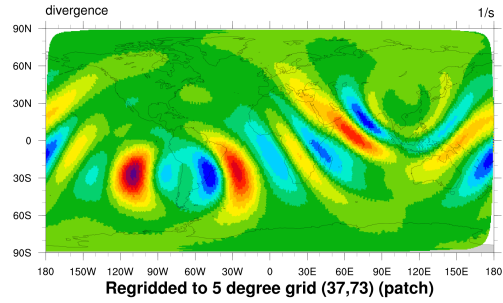


TOPO: Regridded to 0.5 degree 35 x 73 (conserve)

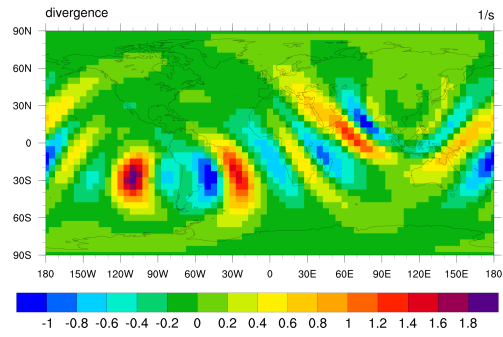


ICON

Original ICON grid (20480 cells)

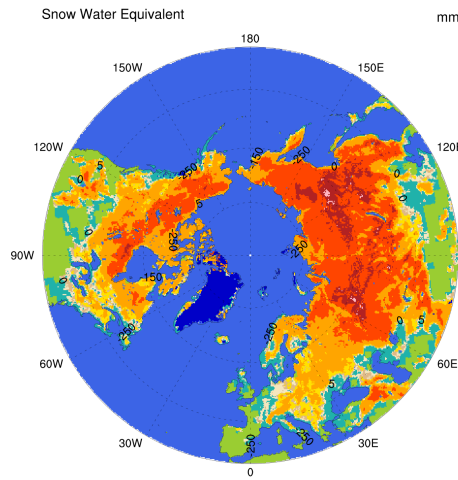


Regridded to 5 degree grid (37,73) (patch)

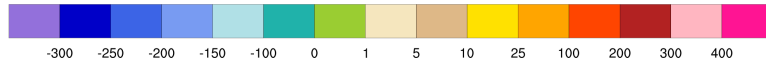
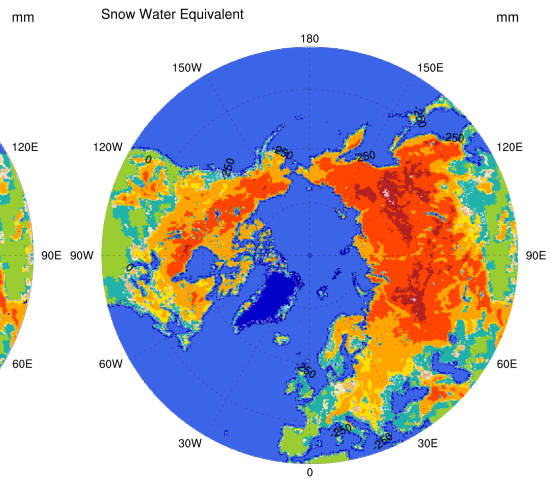


EASE

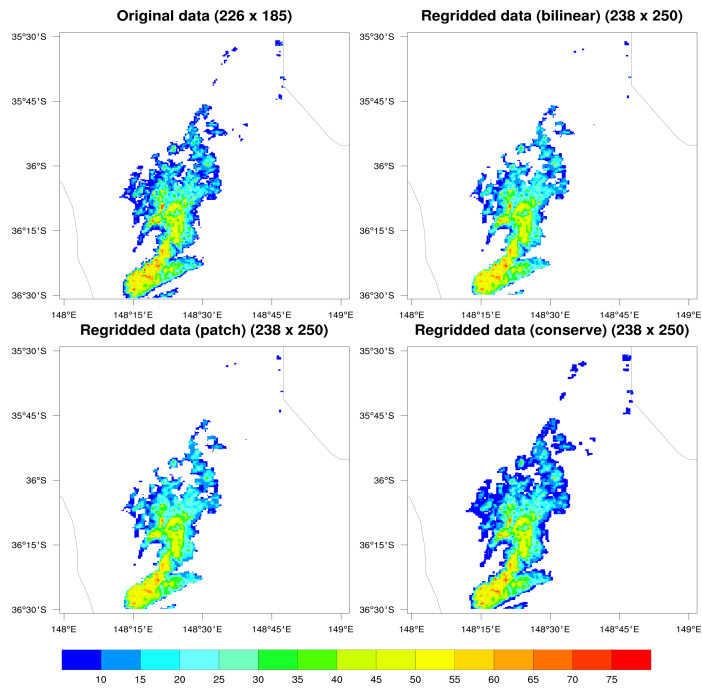
Original EASE grid (721,721)



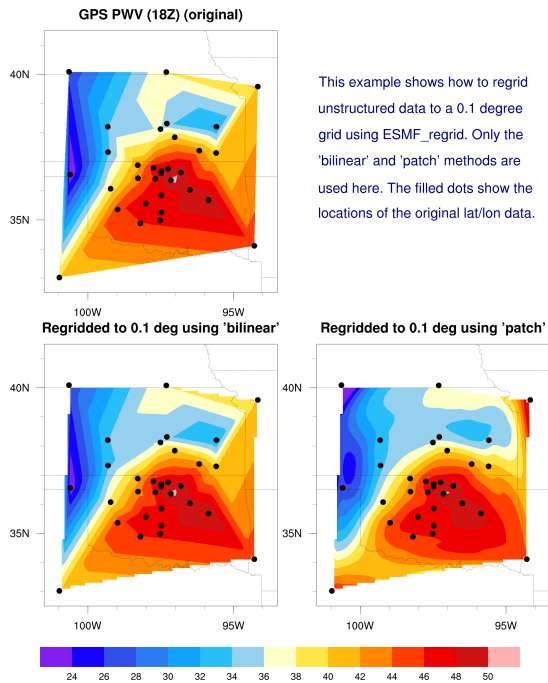
Regridded to 0.25 degree grid (359 x 1439)



Swath to WRF Grid: Australia Snow

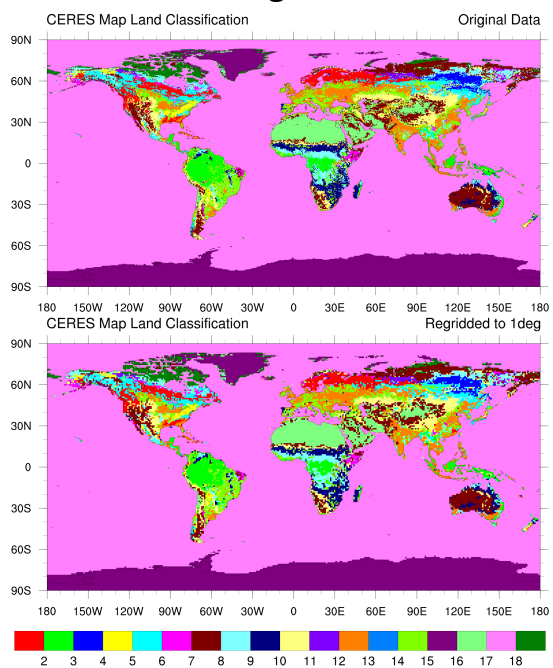


Random to Grid



This example shows how to regrid unstructured data to a 0.1 degree grid using ESMF_regrid. Only the 'bilinear' and 'patch' methods are used here. The filled dots show the locations of the original lat/lon data.

Categorical



Demo
ESMF regridding

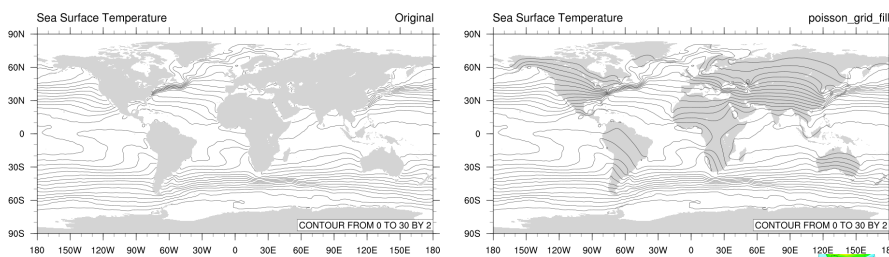
poisson_grid_fill

Tip

Replaces all `_FillValue` grid points

- Poisson's equation solved via relaxation
- Values at non-missing locations are used as boundary conditions
- Works on any grid with spatial dimensions `[*][*]`

```
in = addfile ("ocean.nc", "r")
sst = in->SST
poisson_grid_fill (sst, True, 1, 1500, 0.02, 0.6, 0)
```



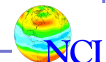
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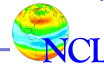
Introduction to NCL Data Analysis



Creating your own functions and procedures

- Crucial for repetitive tasks
- Customize existing ones for your needs
- Give them to other people
- Contribute back to NCL team!

Introduction to NCL Data Analysis



NCL scripts

- Use "load" command, similar to Python's "import":

```
load "./myscript.ncl"  
load "/glade/p/haley/myscript.ncl"  
load "$NCARG_ROOT/lib/ncarg/nclscripts/csm/crop.ncl"
```

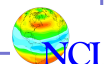
- Examine contents of any script distributed with NCL

```
less $NCARG_ROOT/lib/ncarg/nclscripts/csm/crop.ncl  
more $NCARG_ROOT/lib/ncarg/nclscripts/csm/contributed.ncl
```

- Use any UNIX editor to extract code and modify for your needs

```
vi $NCARG_ROOT/lib/ncarg/nclscripts/csm/contributed.ncl
```

Introduction to NCL Data Analysis



Example: modifying `printMinMax` procedure
 [in `$NCARG_ROOT/lib/ncarg/ncscripts/csm/contributed.ncl`]

Original procedure	Modified procedure - "myprint.ncl"
<pre> undef("printMinMax") procedure printMinMax (x:numeric,optSpace:logical) begin vLongName = (/long_name, "description", "standard_name"/) vUnits = get_valid_units() long_name = "" units = "" do n=0,dimsizes(vLongName)-1 if (isatt(x,vLongName(n))) then long_name = x\$\$vLongName(n)\$ end if end do if(long_name.ne."") then do n=0,dimsizes(vUnits)-1 if (isatt(x,vUnits(n))) then units = x\$\$vUnits(n)\$ end if end do end if if (optSpace) then print (" ") end if if(units.ne."") then print (long_name+ " (" +units+)" " : min="+min(x)+\ " " max="+max(x)") else print (long_name+ " : min="+min(x)+ " max="+max(x)) end if end </pre>	<pre> undef("printMinMax") procedure printMinMax (x:numeric) begin vLongName = (/long_name, "description", "standard_name"/) vUnits = get_valid_units() long_name = "" units = "" do n=0,dimsizes(vLongName)-1 if (isatt(x,vLongName(n))) then long_name = x\$\$vLongName(n)\$ end if end do if(long_name.ne."") then do n=0,dimsizes(vUnits)-1 if (isatt(x,vUnits(n))) then units = x\$\$vUnits(n)\$ end if end do end if :: if (optSpace) then :: print (" ") :: end if if(units.ne."") then print (long_name+ " (" +units+)" " : min="+min(x)+\ " " max="+max(x)") else print (long_name+ " : min="+min(x)+ " max="+max(x)) end if end </pre>
<pre> load "./myprint.ncl" f = addfile("uv300.nc","r") u = f->U(0,,:) printMinMax(u) ; No second argument! </pre>	

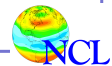
General structure of NCL function/procedure

```

undef ("function_name") ; optional, HIGHLY recommended
function function_name (declaration_list)
local local_variable_list ; optional
begin
  ...statements...
  return(...)
end

undef ("procedure_name") ; optional, HIGHLY recommended
procedure procedure_name (declaration_list)
local local_variable_list ; optional
begin
  ...statements...
end

```



Example: `mult` function – one script

Script

```
undef ("mult")
function mult(x1,x2,x3,x4)
local sx1, foo
begin
  sx1      = sin(0.01745329*x1)
  foo      = sx1*x2*x3*sqrt(x4)
  foo@long_name = "result"
  foo@units  = "Unknown"
  return (foo)
end

begin
  x = mult(4.7, 34, 567, 2)
  print(x)
end
```

Output

```
Variable: x
Type: float
Number of Dimensions: 1
Number Of Attributes: 2
  long_name : result
  units : Unknown
(0) 2233.906
```

Example: `mult` function – two scripts

myLib.ncl

```
undef ("mult")
function mult(x1,x2,x3,x4)
local sx1, foo
begin
  sx1      = sin(0.01745329*x1)
  foo      = sx1*x2*x3*sqrt(x4)
  foo@long_name = "result"
  foo@units  = "Unknown"
  return (foo)
end
```

myscript.ncl

```
load "myLIB.ncl"

begin
  x = mult(4.7, 34, 567, 2)
  print(x)
end
```

NOTE: myLib.ncl can contain multiple scripts

Create your own printMinMax, printVarSummary with shorter names

```
my_ncl_lib.ncl
```

```
undef("printm")  
procedure printm (x:numeric)  
begin  
  printMinMax(x,0)  
end  
  
undef("printv")  
procedure printv (x)  
begin  
  printVarSummary(x)  
end
```

```
load "./my_ncl_lib.ncl"  
  
f = addfile("uv300.nc","r")  
u = f->U(0, :, :)  
printv(u)  
printm(u)
```

Function / procedure prototyping

- Arguments passed by reference
- Can specify type and/or size, or neither

```
procedure ex(year [12]:integer, title:string)
```

```
function xy_interp(x1 [*][*][*]:numeric, x2:numeric)
```

```
function set_color(cmap [*][3]:float, res [1]:logical)
```

```
procedure whatever(a, b, c)
```

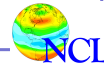
Sneaking in extra arguments

- Use attributes, which are just like variables
- Add extra argument to attach these attributes

```
procedure ex(data, text, opt:logical)
begin
  . . .
  if (opt .and. isatt(opt,"scale")) then
    d = data*opt@scale
  end if
  if (opt .and. isatt(opt,"add")) then
    d = data + opt@add
  end if
  if (opt .and. isatt(opt,"wgts")) then
    . . .
  end if
  . . .
end
```

```
optArg      = True
optArg@scale = 0.01
optArg@add  = 1000
optArg@wgts = (/1,2,1/)
optArg@name = "sample"

ex(x2D, "Example", optArg)
```



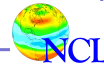
Demo

Creating your own functions

NCL Data Analysis Outline

- Goals
- Functions and procedures overview
- Essential utility functions
- Special `_Wrap` functions / metadata
- WRF functions
- Creating your own functions and procedures
- Regridding functions
- **Calling Fortran code from NCL**
- Command line arguments
- Programming tips / Clean coding / Best practices

Introduction to NCL Data Analysis



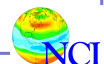
Calling Fortran routine from NCL

- Easier to use F77 code, but works with F90
- Isolate definition of input variables and wrap with special comment statements:

```
C NCLFORTSTART  
. . .  
C NCLEND
```
- Use a tool called **WRAPIT** to create a **xxxx.so** file
- Load **xxxx . so** file in NCL script with "external" statement
- Call Fortran function with special **::** syntax
- **Must preallocate arrays!** (using NCL's **new** statement)

<http://www.ncl.ucar.edu/Document/Tools/WRAPIT.shtml>

Introduction to NCL Data Analysis



Sample Fortran 77 code

```
C NCLFORTSTART
subroutine compute_tk(tk,pressure,theta,nx,ny,nz)
implicit none
integer nx, ny, nz
real tk(nx, ny, nz)
real pressure(nx, ny, nz), theta(nx, ny, nz)
C NCLEND
integer i, j, k
real pi

do k=1,nz
  do j=1,ny
    do i=1,nx
      pi = (pressure(i,j,k)/1000.)**(287./1004.)
      tk(i,j,k) = pi*theta(i,j,k)
    end do
  end do
end do
end
```

Create "myTK.so" file and use in script

From UNIX command line:

```
WRAPIT myTK.f
```

This will create a "**myTK.so**" file

```
external myTK "./myTK.so"

p = a->pressure
t = a->T
t = t + 300

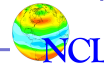
;---Must preallocate space for output arrays
dim = dimsizes(t)
tk = new( dimsizes(t), typeof(t) )

;---Remember, Fortran/NCL arrays are ordered differently
myTK :: compute_tk (tk,p,t,dim(2),dim(1),dim(0))
```

Calling Fortran 90 from NCL

- Can use simple Fortran 90 code
- Your F90 program cannot contain any of the following features:
 - pointers or structures as arguments
 - missing or optional arguments
 - keyword arguments
 - recursive procedures
- The input arguments must be reproduced in a separate F77-like "stub" file
- "WRAPIT" is a modifiable script

Introduction to NCL Data Analysis



Sample Fortran 90 code with "stub file"

myTK.f90

```
subroutine compute_tk (tk, pres, theta, nx, ny, nz)
  implicit none
  integer :: nx,ny,nz
  real, dimension (nx,ny,nz) :: tk, pres, theta, pi

  pi = (pres/1000.)**(287./1004.)
  tk = pi * theta

end subroutine compute_tk
```

myTK.stub "stub file" should look like F77 code

```
C NCLFORTSTART
subroutine compute_tk (tk, pres, theta, nx, ny, nz)
  implicit none
  integer nx,ny,nz
  real    tk(nx,ny,nz)
  real    pres (nx,ny,nz) , theta (nx,ny,nz)
C NCLEND
```

Using WRAPIT with a stub file

From UNIX command line:

```
WRAPIT myTK.f mkTK.stub
```

This will create a "myTK.so" file

NCL script will be exactly the same

```
external myTK "./myTK.so"  
  
p = a->pressure  
t = a->T  
t = t + 300  
  
;---Must preallocate space for output arrays  
dim = dimsizes(t)  
tk = new( dimsizes(t), typeof(t) )  
  
;---Remember, Fortran/NCL arrays are ordered differently  
myTK :: compute_tk (tk,p,t,dim(2),dim(1),dim(0))
```

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Command Line Arguments (CLAs)

- Allows you to set variables *when you run NCL*
- Assume you have 3-line "cla.ncl" script:

```
print("title = '" + t + "'")
y = x * 0.01
print("y = "+y)
```

- Running "ncl cla.ncl" will give you errors:

```
fatal:Variable (t) is undefined
fatal:Variable (x) is undefined
fatal:Variable (y) is undefined
```

- Instead, run NCL with:

```
ncl x=5000 'title="CLAs"' cla.ncl
```

```
(0) title = 'CLAs'
(0) y = 50
```

http://www.ncl.ucar.edu/Document/Manuals/Ref_Manual/NclCLO.shtml

Introduction to NCL Data Analysis



CLAs: more detailed example

```
if (.not. isvar("fNam") .and. (.not. isvar("var")) ) then
  print("fNam not specified: exiting")
  exit
end if

f = addfile (fNam, "r") ; open file
x =f->$var$           ; read variable

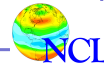
if (.not. isvar("year")) then
  year = 1900           ; provide default
end if
if (.not. isvar("lev")) then
  lev = 500             ; provide default
end if
```

```
ncl year=1930 'lev=(/250, 750/)' 'var="T"' 'fNam="foo.nc"' sample.ncl
```

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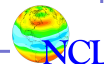
Introduction to NCL Data Analysis



Things to think of when coding

- Am I writing this for me or someone else?
 - Reusability is important, even for yourself
- How generic does it need to be?
- Clean coding, even for small scripts
 - Find your coding style and get into the habit
- RTM
 - Make sure you are using the best function for the job
- Manage memory carefully
- Write the test before the code 😊

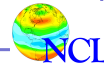
Introduction to NCL Data Analysis



Clean coding practices

- Use indentation (and do it consistently)
- Comment code well
- Start with existing scripts
- Reuse code!
- Use meaningful variables names
- Use functions for repetitive tasks
- Use "\" character to break long lines
- Don't hard-code values
- Test as you go
- Use editor enhancements

Introduction to NCL Data Analysis



Watch those do loops! (1 of 3)

Code that doesn't change inside do loop should be moved outside do loop

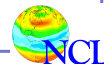
No

```
colors = (/ "blue", "red", "tan", ... /)
do nv=0, nvars-1
  vname = "var" + nv
  x = a->time
  y = x->$vname$
  res = True
  res@gsnMaximize = True
  res@xyLineColor = colors(nv)
  plot = gsn_xy(wks, x, y, res)
end do
```

Yes

```
x = a->time
res = True
res@gsnMaximize = True
colors = (/ "blue", "red", "tan", ... /)
do nv=0, nvars-1
  vname = "var" + nv
  y = x->$vname$
  res@xyLineColor = colors(nv)
  plot = gsn_xy(wks, x, y, res)
end do
```

Introduction to NCL Data Analysis



Watch those do loops! (2 of 3)

Take advantage of array arithmetic – cleaner and MUCH faster!

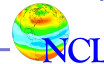
No

```
; nx = ny = nz = 100
tk = new((/nx,ny,nz/),float)
do k=0,nz-1
  do j=0,ny-1
    do i=0,nx-1
      pi = (p(i,j,k)*0.001)^(0.285)
      tk(i,j,k) = pi*theta(i,j,k)
    end do
  end do
end do
```

Yes – **80x** faster

```
; nx = ny = nz = 100
pi = (p(i,j,k)*0.001)^(0.285)
tk = pi*theta
```

Introduction to NCL Data Analysis



Watch those do loops! (3 of 3)

If can spare the memory, use arrays, especially with strings.

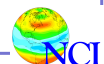
Okay, but...

```
do nv=0,nvars-1
  vname = "var" + nv
  y = x->$vname$
  . . .
end do
```

Maybe better

```
vname = "var" + ispan(0,nvars-1,1)
do nv=0,nvars-1
  y = x->$vname(nv)$
  . . .
end do
```

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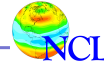


Memory management

- Functions help control memory issues
- Use `delete` to remove large, unneeded variables

```
delete(x)
delete([/x,data,opt/])
```
- Use `(/.../)` around an array to strip metadata
- Avoid reordering data if possible
 - Do it once and save to new variable
 - Make use of `xxxx_n` functions
- Don't use `new` unless you have to
- Strings are expensive!
- Do loops can be useful for large data arrays; do operations across **subset** of data

Introduction to NCL Data Analysis



Debugging tips

- LOOK AT YOUR DATA!
 - Use `print` / `printVarSummary` / `printMinMax` liberally
- If script takes a long time and/or big arrays
 - Write intermediate data to NetCDF
 - Run script with smaller subset of data
 - Use "exit" to skip execution of rest of script
- Use "-x" command line option to echo every line
 - Must comment out the main "begin" and "end"
- Editor enhancements help!
- Read errors and warnings carefully

http://www.ncl.ucar.edu/Document/Language/error_messages.shtml

Introduction to NCL Data Analysis

