# Using R at CHPC

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# Today's agenda:

- Choosing the best way to connect to CHPC for your R application
- Installing R packages
- Using R in parallel

# Methods of using R at CHPC

Command	Attributes
R	Interactive, command line style
RStudio	Interactive, either web browser or X-Windows GUI
Jupyter Lab or Notebook	Interactive, document based, web browser GUI
Rscript	Non-interactive, batch script oriented
R Markdown	Non-interactive, document based

#### Methods to access resources at CHPC

Method	Attributes	Resource	
ssh to interactive node	command line or GUI	interactive node	
FastX to interactive node	command line or GUI, persistence	interactive node	
OnDemand cluster shell access	convenient, like ssh, command line only	interactive node	
SLURM sbatch command	non-interactive (batch mode)	compute node(s)	
SLURM salloc command	interactive command-line or GUI	compute node(s)	
OnDemand system installed applications	web-based access	compute node(s)	

Remember the appropriate uses for interactive and compute nodes:

- Interactive nodes: writing code, installing code, small-scale testing, debugging, managing SLURM jobs
- Compute nodes: heavy-duty computing (simulations, stats, data visualization) whether interactive or not

## R use methods vs. CHPC access methods

	R	RStudio	Jupyter	RScript	R Markdown
ssh (to interactive node)					
FastX (to interactive node)					
OnDemand cluster shell access (runs on interactive node)					
SLURM sbatch (compute node)					
SLURM salloc (compute node)					
OnDemand system installed applications (runs on compute nodes)					

### R use methods vs. CHPC access methods

	R	RStudio	Jupyter	RScript	R Markdown
ssh (to interactive node)	good for testing	✓ but slow	Inefficient - not recommended	good for testing	good for testing
FastX (to interactive node)	good for testing		Inefficient - not recommended	good for testing	good for testing
OnDemand cluster shell access (on interactive node)	but no graphics	<ul><li>requires</li><li>x windows</li></ul>	- requires X windows	good for testing	good for testing
SLURM sbatch (compute node)	×	×	×	$\overset{\wedge}{\Rightarrow} \overset{\wedge}{\Rightarrow} \overset{\wedge}{\Rightarrow} \overset{\wedge}{\Rightarrow}$	$\stackrel{\wedge}{\Rightarrow} \stackrel{\wedge}{\Rightarrow}$
SLURM salloc (compute node)	<u> </u>		Inefficient - not recommended		
OnDemand system installed applications (on compute nodes)	×	$\begin{array}{c} & \\ \\ \\ \\ \\ \\ \\ \\ \end{array} \qquad \begin{array}{c} \\ \\ \\ \\ \\ \\ \\ \end{array} \qquad \begin{array}{c} \\ \\ \\ \\ \\ \\ \\ \\ \end{array} \qquad \begin{array}{c} \\ \\ \\ \\ \\ \\ \\ \\ \\ \end{array} \qquad \begin{array}{c} \\ \\ \\ \\ \\ \\ \\ \\ \\ \\ \end{array} \qquad \begin{array}{c} \\ \\ \\ \\ \\ \\ \\ \\ \\ \\ \end{array} \qquad \begin{array}{c} \\ \\ \\ \\ \\ \\ \\ \\ \\ \\ \\ \end{array} \qquad \begin{array}{c} \\ \\ \\ \\ \\ \\ \\ \\ \\ \\ \\ \\ \\ \\ \\ \\ \\ \\ \\$	***	×	×

<sup>&</sup>quot; good for testing" means software works well within computing limits of interactive node

## ssh, FastX, and OnDemand shell access

- These methods provide a terminal window on an interactive node
- Graphics (whether GUI or graphical output) requires X-forwarding
  - On Mac use "ssh -Y username@hostname"
  - On Windows use Xming (<a href="https://xming.en.softonic.com/">https://xming.en.softonic.com/</a>)
  - X-forwarding can be slow without some help
- FastX accelerates X-forwarding
  - Web interface and desktop clients are available
  - Graphics performance much improved over ssh X-forwarding
  - Keyboard copy and paste can be a problem

#### SLURM sbatch and salloc demo

- Both methods provide access to compute nodes
- sbatch is batch oriented therefore non-interactive
  - Submits a shell script to cluster for non-interactive execution
- salloc starts an interactive shell session on a compute node
  - Session started by salloc inherits your environment from interactive node

#### OnDemand demo

- Web portal
- Access to compute nodes (and interactive nodes)
- Great for running web and GUI applications on compute nodes
- Access to compute nodes via Slurm system

# Writing R code for interactive vs batch jobs

- Some tasks are inherently interactive
  - Coding
  - Debugging
  - Data visualization
- Some tasks are inherently batch oriented
  - Large or long-running simulations
  - Processing lots of data files
- To write R code that adapts to both use cases:
  - Write lots of functions (potentially in a separate source code file)
  - Use interactive () to test whether job is interactive or batch

Installing R packages at the CHPC

#### solaR: Radiation and Photovoltaic Systems

Calculation methods of solar radiation and performance of photovoltaic systems from daily and intradaily irradiation data sources.

https://cran.r-project.org/web/packages/solaR/index.html

```
$ module load R
$ R

R version 4.4.0 (2024-04-24) -- "Puppy Cup"

Copyright (C) 2024 The R Foundation for Statistical Computing

Platform: x86_64-pc-linux-gnu

...

> library(solaR)

Error in library(solaR): there is no package called 'solaR'
```

# Strategies for handling missing R libraries

- 1. Tell R where to find the already-installed package
- 2. Find a version of R that has the package installed
- 3. Install the package yourself

#### Strategy 1: Tell R where to find the already-installed package

• When loading a library R searches the path returned by .libPaths()

```
> .libPaths()
[1] "/uufs/chpc.utah.edu/sys/installdir/r8/RLibs/4.4.0"
[2] "/uufs/chpc.utah.edu/sys/installdir/r8/R/4.4.0/lib64/R/library"
```

• One can append additional existing directories to this path:

```
> .libPaths( c( .libPaths(), "~u0253283/R/x86_64-pc-linux-gnu-library/4.4" ) )
> .libPaths()
[1] "/uufs/chpc.utah.edu/sys/installdir/r8/RLibs/4.4.0"
[2] "/uufs/chpc.utah.edu/sys/installdir/r8/R/4.4.0/lib64/R/library"
[3] "/uufs/chpc.utah.edu/common/home/u0253283/R/x86_64-pc-linux-gnu-library/4.4"
```

• However - this doesn't persist from session to session

#### Strategy 1 (continued)

• Or use the R\_LIBS\_USER environment variable:

```
# In bash:
$ export R LIBS USER=~u0253283/R/x86 64-pc-linux-gnu-library/4.4
# Or in tcsh:
$ setenv R LIBS USER ~u0253283/R/x86 64-pc-linux-gnu-library/4.4
$ R
R version 4.4.0 (2024-04-24) -- "Puppy Cup"
Copyright (C) 2024 The R Foundation for Statistical Computing
Platform: x86 64-pc-linux-gnu
> .libPaths()
[1] "/uufs/chpc.utah.edu/common/home/u0253283/R/x86_64-pc-linux-gnu-library/4.4"
[2] "/uufs/chpc.utah.edu/sys/installdir/r8/RLibs/4.4.0"
[3] "/uufs/chpc.utah.edu/sys/installdir/r8/R/4.4.0/lib64/R/library"
```

• This strategy works great for research labs with group space (i.e. a shared file system) that want a shared R library collection

#### Strategy 2: Find a version of R that has the package installed

"The best R package installation is the one you don't have to do."
-- Brett Milash

#### Partial list of R modules at CHPC:

- R/4.2.1-bioconductor
- R/4.2.2
- R/4.3.2-basic
- R/4.3.2-bioconductor
- R/4.3.2-geospatial
- R/4.3.2
- R/4.4.0-basic
- R/4.4.0-bioconductor
- R/4.4.0-geospatial
- R/4.4.0

### CHPC's R modules

Every CHPC R module has useful libraries in addition to the base package:

```
reshape2
        ggvis
                  maptools
                                         testthat
car
                              rgl
                                      threeJS
         glmnet
                    mgcv
caret
data.table googleVis microbenchmark rmarkdown
                                                   tidyr
           htmlwidgets multcomp
devtools
                                    RMySQL
                                                vcd
DiagrammeR httr
                      network3D
                                   RODBC
                                              XI Connect
         isonlite
dplyr
                 nlme
                             roxygen2
                                         xlsx
                           RPostgresSQL XML
DT
         knitr
                  parallel
dygraphs
           leaflet
                     pryr
                              RSQLite
                                         xtable
foreign
          lme4
                    qcc
                             shiny
                                      xts
gcbd
         locfit
                  quantmod
                               sp
                                        ZOO
                     randomForest stringr
          lubridate
ggmap
                               survival
ggplot2
                    Rcpp
          maps
```

- Certain CHPC R modules have additional library collections:
  - Bioconductor
  - Geospatial packages (e.g. proj4, rgdal, RNetCDF, hdf5r)

#### Strategy 3: Install the package yourself

#### Main repositories of R code:

- CRAN: Comprehensive R Archive Network
  - https://cran.r-project.org
  - https://cran.r-project.org/web/packages/available packages by name.html
- Bioconductor: Open-source software for bioinformatics
  - https://www.bioconductor.org
  - https://bioconductor.org/packages/release/bioc/
- Github
  - https://github.com
  - https://github.com/qinwf/awesome-R

Installation method varies depending on repository

# Installing packages from CRAN

Use the install.packages() function, with package name in quotes:

```
$ module load R/4.2.2
$ R
R version 4.4.0 (2024-04-24) -- "Puppy Cup"
> .libPaths()
[1] "/uufs/chpc.utah.edu/sys/installdir/r8/RLibs/4.4.0"
[2] "/uufs/chpc.utah.edu/sys/installdir/r8/R/4.4.0/lib64/R/library"
> install.packages("solaR")
Installing package into '/uufs/chpc.utah.edu/sys/installdir/r8/RLibs/4.4.0'
(as 'lib' is unspecified)
Warning in install.packages("solaR"):
 'lib = "/uufs/chpc.utah.edu/sys/installdir/r8/RLibs/4.4.0" is not writable
Would you like to use a personal library instead? (yes/No/cancel) yes
```

# Installing packages from CRAN (continued)

```
Would you like to create a personal library
'/uufs/chpc.utah.edu/common/home/u0424091/R/x86 64-pc-linux-gnu-library/4.4'
to install packages into? (yes/No/cancel) yes
--- Please select a CRAN mirror for use in this session ---
(A list of CRAN mirror sites pops up - I selected "USA (IA)(https)")
also installing the dependencies 'interp', 'latticeExtra'
trying URL 'https://mirror.las.iastate.edu/CRAN/src/contrib/interp 1.1-4.tar.gz'
* DONE (solaR)
The downloaded source packages are in
'/tmp/RtmpdZF0ge/downloaded_packages'
```

# Installing packages from CRAN (continued)

```
> library(solaR)
Loading required package: zoo
Attaching package: 'zoo'
The following objects are masked from 'package:base':
  as.Date, as.Date.numeric
Loading required package: lattice
Loading required package: latticeExtra
Time Zone set to UTC.
> find.package("solaR")
[1] "/uufs/chpc.utah.edu/common/home/u0424091/R/x86 64-pc-linux-gnu-library/4.4/solaR"
> .libPaths()
[1] "/uufs/chpc.utah.edu/common/home/u0424091/R/x86 64-pc-linux-gnu-library/4.4"
[2] "/uufs/chpc.utah.edu/sys/installdir/r8/RLibs/4.4.0"
[3] "/uufs/chpc.utah.edu/sys/installdir/r8/R/4.4.0/lib64/R/library"
```

# Installing packages from Github

DataExplorer: <a href="https://github.com/boxuancui/DataExplorer">https://github.com/boxuancui/DataExplorer</a>

Use the devtools::install\_github() function, with package name in quotes.

Note that "lib=" is specified! Without that the installation of dependencies will fail.

```
$ module load R
$ R
R version 4.4.0 (2024-04-24) -- "Puppy Cup"
> devtools::install_github("boxuancui/DataExplorer", lib=c("/uufs/chpc.utah.edu/common/home/u0424091/R/x86_64-
pc-linux-gnu-library/4.4"))
Downloading GitHub repo boxuancui/DataExplorer@HEAD
** testing if installed package keeps a record of temporary installation path
* DONE (DataExplorer)
> library(DataExplorer)
```

## Installing packages from Bioconductor

```
> install.packages("BiocManager")
Installing package into '/uufs/chpc.utah.edu/sys/installdir/r8/R/4.4.0/lib64/R/library'
(as 'lib' is unspecified)
Warning in install.packages("BiocManager"):
 'lib = "/uufs/chpc.utah.edu/sys/installdir/r8/R/4.4.0/lib64/R/library" is not writable
Would you like to use a personal library instead? (yes/No/cancel) yes
** testing if installed package can be loaded from final location
** testing if installed package keeps a record of temporary installation path
* DONE (BiocManager)
The downloaded source packages are in
'/tmp/RtmpzCb3wb/downloaded packages'
```

# Installing packages from Bioconductor (continued)

Like devtools::install\_github(), it is safest to specify the "lib=" argument.

```
> BiocManager::install("PFAM.db", lib=c("/uufs/chpc.utah.edu/common/home/u0424091/R/x86_64-pc-linux-gnu-library/4.4"))
...

** testing if installed package can be loaded from final location

** testing if installed package keeps a record of temporary installation path

* DONE (PFAM.db)

The downloaded source packages are in

'/tmp/RtmpzCb3wb/downloaded_packages'
>
```

# Installing packages from source code

- install.packages, BiocManager::install, and devtools::install\_github download the package source code, then compile and install it
- If you have the source code URL you can compile and install it like this:

```
$ wget https://bioconductor.org/packages/3.16/bioc/src/contrib/limma_3.54.2.tar.gz $ R CMD INSTALL --library=$HOME/R/x86_64-pc-linux-gnu-library/4.4 limma_3.54.2.tar.gz
```

This method doesn't handle dependencies however

# anyLib: Install and Load Any Package from CRAN, Bioconductor or Github

- "Made to make your life simpler with packages, by installing and loading a list of packages, whether they are on CRAN, Bioconductor or github. For github, if you do not have the full path, with the maintainer name in it (e.g. "achateigner/topReviGO"), it will be able to load it but not to install it."
- Handles dependencies!
- Installs by default into .libPaths()[1]
- https://cran.r-project.org/web/packages/anyLib/index.html

# renv: Install and Load Any Package from CRAN, Bioconductor or Github

- "Made to make your life simpler with packages, by installing and loading a list of packages, whether they are on CRAN, Bioconductor or github. For github, if you do not have the full path, with the maintainer name in it (e.g. "achateigner/topReviGO"), it will be able to load it but not to install it."
- Handles dependencies!
- Creates a virtual R environment that can be loaded/unloaded as needed
- https://rstudio.github.io/renv/
- \*\*Note\*\* requires pandoc module to be loaded, add to your .custom.sh or .custom.csh file:
  - module load pandoc

# Running parallel R code at CHPC

- On an interactive node should not be using multiple cores
- A Slurm job (either interactive or batch) may not have access to all the cores on a node
- To count all the cores on the machine (which is not what we want):

```
# How many cores are on this machine?
> library(parallel)
> detectCores()
[1] 64
```

To count the cores available to your job:

```
# How many cores are available to me on this node?
> strtoi(Sys.getenv("SLURM_TASKS_PER_NODE"))
[1] 10
# How many cores total are available to my potentially multi-node job:
> strtoi(Sys.getenv("SLURM_NTASKS"))
[1] 10
```

#### CHPC's R documentation

- https://git.io/CHPC-Intro-to-Parallel-Computing-R
  - Excellent examples of parallel R code, both single- and multi-node
- <a href="https://www.chpc.utah.edu/documentation/software/r-language.php">https://www.chpc.utah.edu/documentation/software/r-language.php</a>
  - A few things to note:
    - Setting up a personal library: as we saw, R version 4.X handles (most) of this automatically. This was not the case in R version 3.X.
    - We no longer use Intel's compiler icc for R, we use gcc exclusively which solves some inter-compiler issues.
    - Older versions of R used the file \$HOME/.R/Makevars to specify compile-time options, and this file is largely obsolete (thank goodness!)