

In-Person

*Foundations in
Genomic Analyses*

Creating an R Environment for Analysis with the GCC

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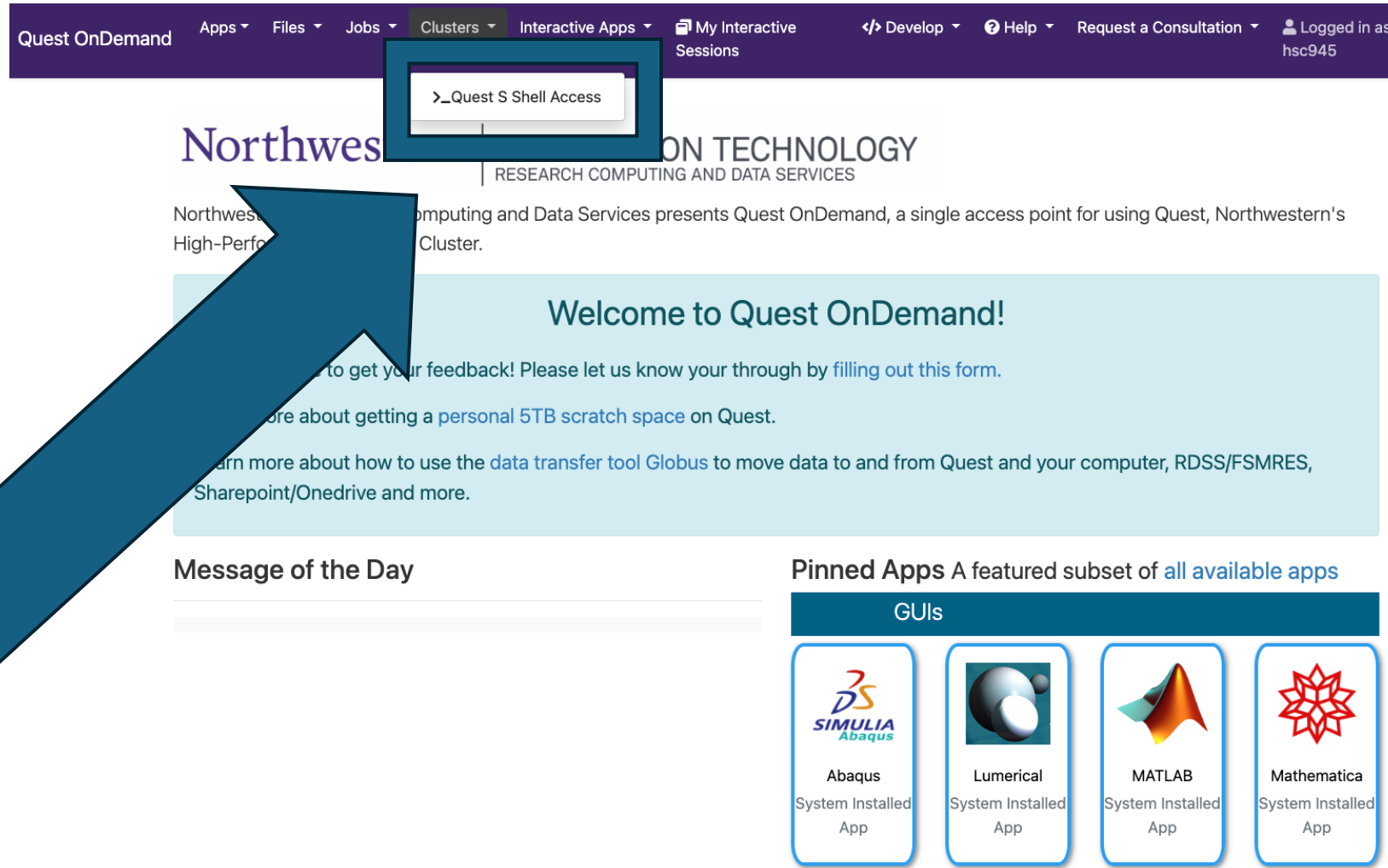
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Northwestern UNIVERSITY RESEARCH COMPUTING AND DATA SERVICES

Welcome to Quest OnDemand!

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Pinned Apps A featured subset of all available apps

GUIs

- Abaqus System Installed App
- Lumerical System Installed App
- MATLAB System Installed App
- Mathematica System Installed App

In the terminal tab that opens...

1. move to our classroom folder

```
cd /projects/e32559
```

2. make your own subfolder if you haven't already

```
mkdir <folder_name>
```


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RStudio Server

TECHNOLOGY
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Quest OnDemand, a single access point for using Quest, Northwestern's

Quest OnDemand!

ough by filling out this form.

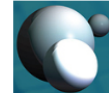
ive data to and from Quest and your computer, RDSS/FSMRES,

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GUIs



Abaqus
System Installed
App



Lumerical
System Installed
App



MATLAB
System Installed
App



Mathematica
System Installed
App

Quest OnDemand link:
qondemand.ci.northwestern.edu

R version: 4.4.0

Additional modules:
hdf5/1.14.1-2-gcc-12.3.0
gsl/2.7.1-gcc-12.3.0 fftw/3.3.10-
gcc-12.3.0 gdal/3.7.0-gcc-12.3.0
nlopt/2.7.1-gcc-12.3.0

Accout: e32559

CPU: 1

Time: 1 hour

Memory: 3

Home / My Interactive Sessions / RStudio Server

Interactive Apps

Desktops

Quest GNOME Desktop

GUIs

ANSYS Workbench or EDT

Abaqus

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Stata

Servers

Jupyter

Jupyter + Spark

RStudio Server

VS Code Server

RStudio Server version: 03ca38c

This app will launch RStudio Server on the Quest cluster. Please take special care to list any additional modules in the appropriate section of the form below that you need to install and run R packages.

Please see Using R on Quest for more information about R on HPC.

Quest installation of R to use in RStudio Server

R-4.4.0

List of other modules you want to load into your RStudio Server environment.

hdf5/1.14.1-2-gcc-12.3.0 gsl/2.7.1-gcc-12.3.0 fftw/3.3.10-gcc-12.3.0 gdal/3.7.0-gcc-12.3.0

Select to use a virtual environment with RStudio Server

Launch a Clean RSession: Will not attempt to load previous session data

SLURM Partition

short

SLURM Account

e32559

Number of CPUs/cores/processors

1

Why these additional modules?

- sometimes R packages use software in addition to R as dependencies
- for example:
 - hdf5r is an R package for linking to HDF5 binary data format so it also needs the software for HDF5 data formats
 - nloptr is an R package that interfaces with NLOpt software for non-linear optimization, so it also needs the NLOpt software available

If you install an R package and get an error about missing files that are named something like libssl.so, or being unable to link to something that usually means you're missing some dependent software.

R packages

- base R has a lot of built in and useful functions
- many people write packages with additional functions for specific analyses/tasks
- for example, tidyverse
- first step is often to load necessary packages into your environment (or to install them)

```
# load packages  
library(Seurat)  
library(SeuratData)  
library(SeuratWrappers)  
library(Azimuth)  
library(ggplot2)  
library(patchwork)  
  
# now I can do analyses!
```


install.packages() vs library()

- `install.packages()`, or other install commands, downloads and installs the desired package from the internet to your computer
- `library()` loads a package that is already installed on your computer to your active software environment

You can only use the functions in your active software environment!

```
select(tibble, column1, column2) # error
```

```
library(dplyr)
```

```
select(tibble, column1, column2) # works!
```

Where do R packages go when you install?

- `install.packages()` will use the output of `.libPaths()` to determine where to install packages
- by default, it knows about
 - where the version of R you're using was installed
 - and your home directory

Run `.libPaths()` in your console to see these paths.

.libPaths()

```
[1] "/home/hsc945/R/x86_64-pc-linux-gnu-library/4.4"  
[2] "/hpc/software/spack_v20d1/spack/opt/spack/linux-rhel7-  
x86_64/gcc-12.3.0/r-4.4.0-  
aaqsqjfnzw5p5c4twtdj4sxqi23pyfw/rlib/R/library"
```

Let's take a look!

cd /home/<netid>/R/x86_64-pc-linux-gnu-library/4.4

ls

```
(base) [hsc945@quser34 4.4]$ ls
abind      Deriv      gtools     modelr     RcppArmadillo  spatstat.random
affy       desc      hardhat    MsCoreUtils RcppEigen       spatstat.sparse
affyio     devtools  haven      MultiAssayExperiment RcppGSL         spatstat.utils
AnnotationFilter diagram  hdf5r      munsell     RcppHNSW        SQUAREM
askpass    diffobj   here       mzID         RcppParallel    StanHeaders
backports  digest    highr      nbpMatching RcppProgress     statmod
base64enc  distributional Hmisc      nlme         RcppTOML         stringfish
bayesplot  doBy      hms        nloptr       RcppZiggurat     stringi
BH         doParallel htmlTable  nnet         readr           stringr
Biobase    dotCall64 htmltools  numDeriv     readxl          SummarizedExperiment
BiocBaseUtils downlit   htmlwidgets openssl      recipes        survival
BiocGenerics dplyr     httpuv     pacman       rematch         svglite
BiocManager dqrng     httr       parallelly   rematch2        sys
BiocParallel DT         httr2      patchwork    remotes        systemfonts
BiocVersion dtplyr    ica        pbapply      repex          tensor
bit        dygraphs  ids        pbkrtest     reshape2        tensorA
bit64      e1071     igraph     pcaMethods   reticulate      terra
bitops     ellipsis  impute     pillar       Rhdf5lib        testthat
blob       evaluate  ini        pkgbuild     rlang           textshaping
boot       fansi     inline     pkgconfig    rmarkdown       threejs
```

You can also look in x86_64-pc-linux-gnu-library for other R versions and the packages you've installed for them.

Why might having one 4.4 folder for packages be a problem?

- different versions of packages may not be compatible
- different version of the same package might have different syntax
- you may work on projects that need different packages with the same version of R
- you may upgrade from R/4.4.0 to R/4.4.1 and find compatibility issues

What is the solution?

All package manager systems are basically **making separate folders for each environment**.

1. You can manually make different folders for different projects.
2. You can use Renv to control R package environments.
3. You can use mamba to create software environments for R or many other pieces of software.

What is the solution?

All package manager systems are basically **making separate folders for each environment**.

1. You can manually make different folders for different projects.
2. You can use Renv to control R package environments.
3. You can use mamba to create software environments for R or many other pieces of software.

Note: We will cover 1 and 3 today, not because 2 isn't a good option but because of what we have experience with and because 3 can be useful beyond R for software environments on Quest.

Specify a custom location for packages.

In terminal:

```
cd <your folder in our classroom allocation>  
mkdir R_packages
```

In R:

```
.libPaths("/projects/e32559/<your folder>/R_packages")  
.libPaths() # should see new folder on top
```

Note: If you click from the “Files” to the “Packages” tab in the lower right hand window you can see what’s available change as you change .libPaths().

Install packages

```
install.packages("BiocManager")
```

you can see this in your folder when it's done

```
BiocManager::install("SingleCellExperiment")
```

this will take a while, so let it run. It also installs all dependent packages because we're starting from an almost empty folder.

```
BiocManager::install("scater")
```

```
BiocManager::install("OSCA.intro")
```

BiocManager installs from Bioconductor

- Bioconductor is a repository, like CRAN
- hosts R packages for bioinformatics
- has its own semi-solution for version control:
 - specific versions of BiocManager tied to specific version of R
 - specific versions of each package tied to each version of BiocManager
- <https://www.bioconductor.org/>



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Open source software for
Bioinformatics

The Bioconductor project aims to develop and share open source software for precise and repeatable analysis of biological data.
We foster an inclusive and collaborative community of developers and data scientists.

[Get started >](#)

Install packages

```
install.packages("BiocManager")
```

```
BiocManager::install("SingleCellExperiment")
```

```
# now should have many more R packages in install folder
```

```
# load the functions from SingleCellExperiment with
```

```
library(SingleCellExperiment)
```

Virtual environments for R and beyond

- mamba allows you to build software environments with more functionality than just a separate folder
- great for version control, and checking compatibility when you want to add something new
- exportable so others on the same system can copy your environment

In the terminal:

```
module load mamba/24.3.0
```



```
mamba create --name scexp -c conda-forge -c bioconda bioconductor-singlecellexperiment
```

Package	Version	Build	Channel
Install:			
+ _libgcc_mutex	0.1	conda_forge	conda-forge/linux-64
+ _openmp_mutex	4.5	2_gnu	conda-forge/linux-64
+ _r-mutex	1.0.1	anacondar_1	conda-forge/noarch
+ argcomplete	3.5.1	pyhd8ed1ab_0	conda-forge/noarch
+ binutils_impl_linux-64	2.40	hf600244_0	conda-forge/linux-64
+ bioconductor-biobase	2.62.0	r43ha9d7317_2	bioconda/linux-64
+ bioconductor-biocgenerics	0.48.1	r43hdfd78af_2	bioconda/noarch
+ bioconductor-data-packages	20231203	hdfd78af_0	bioconda/noarch
+ bioconductor-delayedarray	0.28.0	r43ha9d7317_2	bioconda/linux-64
+ bioconductor-genomeinfodb	1.38.1	r43hdfd78af_1	bioconda/noarch
+ bioconductor-genomeinfodbdata	1.2.11	r43hdfd78af_1	bioconda/noarch
+ bioconductor-genomicranges	1.54.1	r43ha9d7317_2	bioconda/linux-64
+ bioconductor-iranges	2.36.0	r43ha9d7317_2	bioconda/linux-64
+ bioconductor-matrixgenerics	1.14.0	r43hdfd78af_3	bioconda/noarch
+ bioconductor-s4arrays	1.2.0	r43ha9d7317_2	bioconda/linux-64
+ bioconductor-s4vectors	0.40.2	r43ha9d7317_2	bioconda/linux-64
+ bioconductor-singlecellexperiment	1.24.0	r43hdfd78af_0	bioconda/noarch
+ bioconductor-sparsearray	1.2.2	r43ha9d7317_2	bioconda/linux-64
+ bioconductor-summarizedexperiment	1.32.0	r43hdfd78af_0	bioconda/noarch
+ bioconductor-xvector	0.42.0	r43ha9d7317_2	bioconda/linux-64
+ bioconductor-zlibbioc	1.48.0	r43ha9d7317_2	bioconda/linux-64

If you scroll down, you'll see this list also includes r-base (which is R) as well as other R packages.

Hit Y and then enter.

This will also take a while, be patient.

Using a virtual environment with QOD

- Select to use a virtual environment with RStudio Server

- This will remove the modules, as everything should be in the environment.
- Change the job name so you can keep track!

Home / My Interactive Sessions / RStudio Server

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Servers

- Mathematica
- QGIS
- RELION
- SimBA
- Stata
- Jupyter
- Jupyter + Spark
- RStudio Server**
- VS Code Server

RStudio Server version: 03ca38c

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☐ Quest installation of R to use in RStudio Server

R-4.4.0

☐ List of other modules you want to load into your RStudio Server environment.

hdf5/1.14.1-2-gcc-12.3.0 gsl/2.7.1-gcc-12.3.0 fftw/3.3.10-gcc-12.3.0 gdal/3.7.0-g

☐ Select to use a virtual environment with RStudio Server

☒ Launch a Clean RSession: Will not attempt to load previous session data

☐ SLURM Partition

short

☐ SLURM Account

e32559

☐ Number of CPUs/cores/processors

1

Using a virtual environment with QOD

- Select to use a virtual environment
- You will only see environments you created, even though they are in a shared folder.



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RStudio Server version: 03ca38c

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Please see [Using R on Quest](#) for more information about R on HPC.

☒ Select to use a virtual environment with RStudio Server

Choose the virtual environment that you want to use

☒ Launch a Clean RSession: Will not attempt to load previous session data

SLURM Partition

SLURM Account

Number of CPUs/cores/processors

R

FileEditCodeViewPlotsSessionBuildDebugProfileToolsHelp

Go to file/function

Addins

hsc945

Project: (None)

ConsoleTerminalBackground Jobs

R 4.3.3 · ~/

R version 4.3.3 (2024-02-29) -- "Angel Food Cake"
Copyright (C) 2024 The R Foundation for Statistical Computing
Platform: x86_64-conda-linux-gnu (64-bit)

R is free software and comes with ABSOLUTELY NO WARRANTY.
You are welcome to redistribute it under certain conditions.
Type 'license()' or 'licence()' for distribution details.

Natural language support but running in an English locale

R is a collaborative project with many contributors.
Type 'contributors()' for more information and
'citation()' on how to cite R or R packages in publications.

Type 'demo()' for some demos, 'help()' for on-line help, or
'help.start()' for an HTML browser interface to help.
Type 'q()' to quit R.

>

EnvironmentHistoryConnectionsTutorial

Import Dataset77 MiB

List

RGlobal Environment

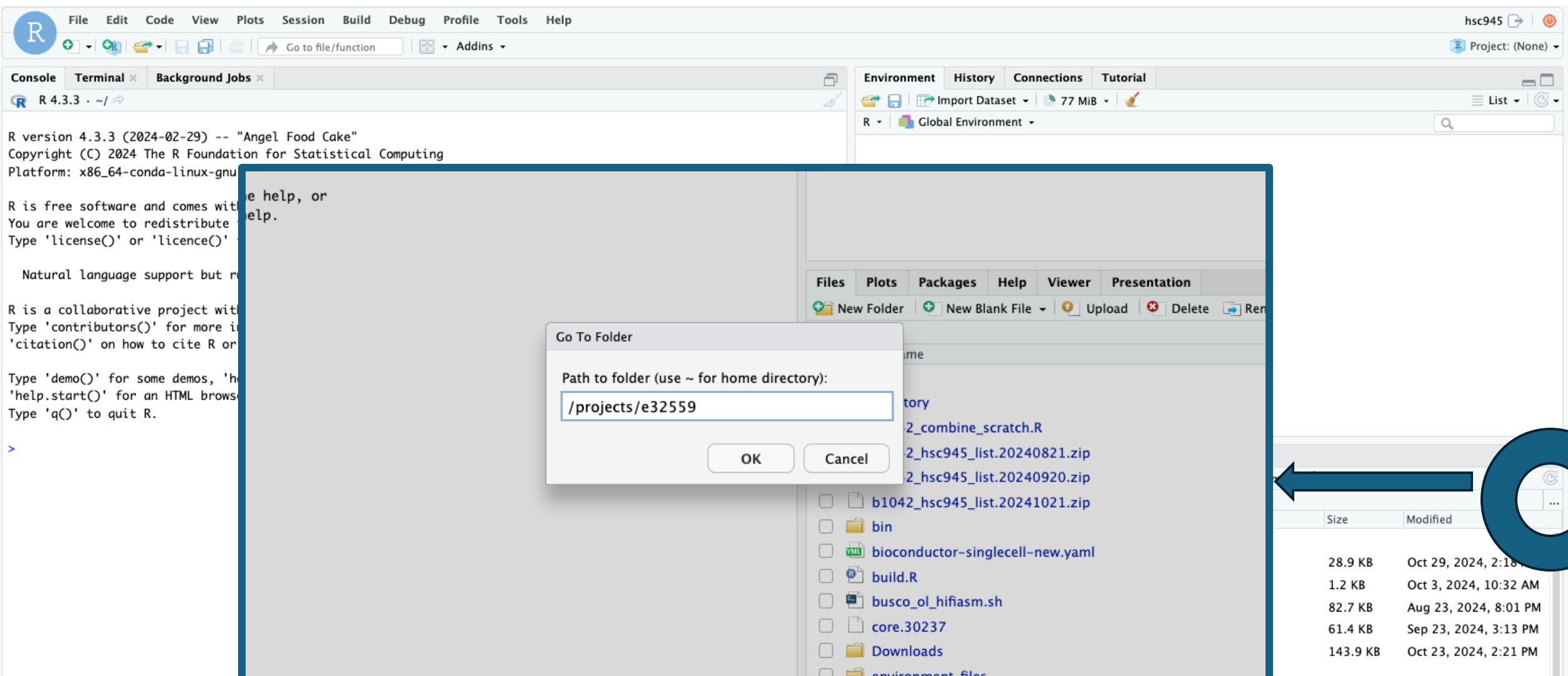
Environment is empty

FilesPlotsPackagesHelpViewerPresentation

New FolderNew Blank FileUploadDeleteRenameMore

Home

	Name	Size	Modified
<input type="checkbox"/>	.r		
<input type="checkbox"/>	.Rhistory	28.9 KB	Oct 29, 2024, 2:18
<input type="checkbox"/>	b1042_combine_scratch.R	1.2 KB	Oct 3, 2024, 10:32 AM
<input type="checkbox"/>	b1042_hsc945_list.20240821.zip	82.7 KB	Aug 23, 2024, 8:01 PM
<input type="checkbox"/>	b1042_hsc945_list.20240920.zip	61.4 KB	Sep 23, 2024, 3:13 PM
<input type="checkbox"/>	b1042_hsc945_list.20241021.zip	143.9 KB	Oct 23, 2024, 2:21 PM
<input type="checkbox"/>	hin		



R version 4.3.3 (2024-02-29) -- "Angel Food Cake"
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Type 'q()' to quit R.

>

Go To Folder

Path to folder (use ~ for home directory):

OK Cancel

Files Plots Packages Help Viewer Presentation

New Folder New Blank File Upload Delete Rename

- ☐ b1042_hsc945_list.20241021.zip
- ☐ bin
- ☐ bioconductor-singlecell-new.yaml
- ☐ build.R
- ☐ busco_ol_hifiasm.sh
- ☐ core.30237
- ☐ Downloads
- ☐ environment_files
- ☐ h.all.v5.2.symbols.gmt

Size	Modified
28.9 KB	Oct 29, 2024, 2:18 PM
1.2 KB	Oct 3, 2024, 10:32 AM
82.7 KB	Aug 23, 2024, 8:01 PM
61.4 KB	Sep 23, 2024, 3:13 PM
143.9 KB	Oct 23, 2024, 2:21 PM

R 4.3.3 · ~/

```
R version 4.3.3 (2024-02-29) -- "Angel Food Cake"
Copyright (C) 2024 The R Foundation for Statistical Computing
Platform: x86_64-conda-linux-gnu (64-bit)
```

```
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You are welcome to redistribute it under certain conditions.
Type 'license()' or 'licence()' for distribution details.
```

```
Natural language support but running in an English locale
```

```
R is a collaborative project with many contributors.
Type 'contributors()' for more information and
'citation()' on how to cite R or R packages in publications.
```

```
Type 'demo()' for some demos, 'help()' for on-line help, or
'help.start()' for an HTML browser interface to help.
Type 'q()' to quit R.
```

```
> |
```

You should be able to open and execute the example code in this file now with your virtual environment. If you'd like to learn more about this example, it was taken from a SingleCellExperiment vignette:

<https://www.bioconductor.org/packages/release/bioc/vignettes/SingleCellExperiment/inst/doc/intro.html>



Import Dataset 77 MiB

R Global Environment

Environment is empty

Files Plots Packages Help Viewer Presentation

New Folder New Blank File Upload Delete Rename More

/ > projects > e32559

	Name	Size	Modified
<input type="checkbox"/>	mkgraham		
<input type="checkbox"/>	oh.polished.fasta	1.2 GB	Oct 8, 2024, 4:37 PM
<input type="checkbox"/>	pls360		
<input type="checkbox"/>	Preeti		
<input type="checkbox"/>	PYpractice		
<input type="checkbox"/>	ria		
<input type="checkbox"/>	salina		
<input type="checkbox"/>	sequence-alignment		
<input type="checkbox"/>	singlecellobject.R	447 B	Nov 5, 2024, 9:33 AM
<input type="checkbox"/>	software		
<input type="checkbox"/>	sophen		
<input type="checkbox"/>	SRR7773980_1.fastq.gz	936.1 MB	Oct 8, 2024, 4:15 PM
<input type="checkbox"/>	SRR7773980_2.fastq.gz	937.3 MB	Oct 8, 2024, 4:15 PM
<input type="checkbox"/>	SRR7773980.bam	2.5 GB	Oct 8, 2024, 4:39 PM
<input type="checkbox"/>	steven781224		
<input type="checkbox"/>	sungsoolim		
<input type="checkbox"/>	Tien		
<input type="checkbox"/>	TRIN_5690_11_S31_L001_R1_001.fastq.gz	77.6 MB	Oct 8, 2024, 4:26 PM
<input type="checkbox"/>	TRIN_5690_11_S31_L001_R2_001.fastq.gz	75.2 MB	Oct 8, 2024, 4:26 PM
<input type="checkbox"/>	Wals_12_10_S28_L001_R1_001.fastq	1.1 GB	Oct 8, 2024, 4:16 PM
<input type="checkbox"/>	Wals_12_10_S28_L001_R2_001.fastq.gz	240.6 MB	Oct 8, 2024, 4:16 PM
<input type="checkbox"/>	Wals_12_10_S28_L001_R2_001.fastq	1.3 GB	Oct 8, 2024, 4:40 PM

To use this environment with Jupyter we would need to add one more thing...

```
source activate /home/<netid>/.conda/envs/scexp
```

```
mamba install -c conda-forge jupyter r-irkernel
```

```
R -e "IRkernel::installspec(name='scexp', displayname='Rscexp')"
```

More resources

- Youtube video on installing R packages generally:
<https://www.youtube.com/watch?v=GM6MCBkVNtQ>
- Bioconductor website: <https://www.bioconductor.org/>
- Quest Knowledge Base article on troubleshooting R installs:
<https://services.northwestern.edu/TDClient/30/Portal/KB/ArticleDet?ID=1834>
- Quest Knowledge Base article on using R on Quest:
<https://services.northwestern.edu/TDClient/30/Portal/KB/ArticleDet?ID=1556#:~:text=R%20packages%20intended%20for%20use,the%20details%20for%20further%20assistance.>