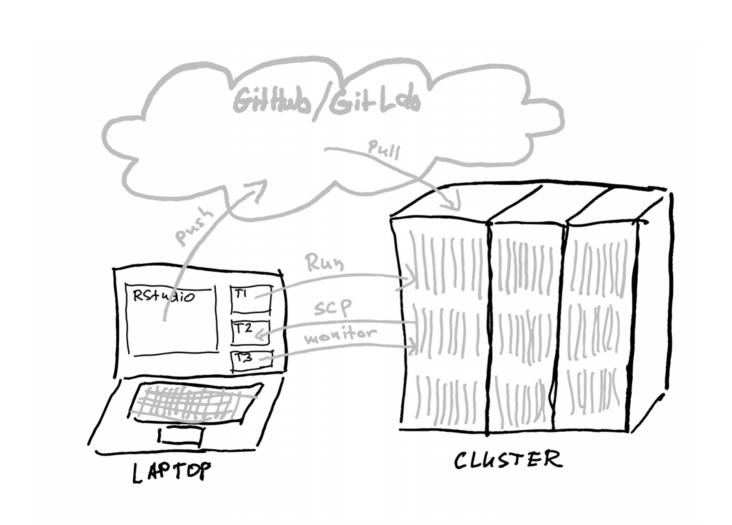


## Review

- Bootstrap, Bagging, Boosting, and Crossvalidation
- Random forest variable subset size crossvalidation
- Matrix libraries introduction

# Typical Workflow from Laptop to Cluster



## GitHub Authentication on IT41

#### **Internet Protocols**

A set of rules and formats governing network communication. Messages are split into packets have a specific set of binary formats.

### **ssh** protocol

Secure Shell Protocol is a network protocol for secure services over an unsecured network, especially login and command line shell interface.

### http (https) protocol

Hypertext Transfer Protocol (Secure) is an application layer network protocol for media information systems, especially as the basis for the World Wide Web.

## GitHub Authentication on IT41

- clone via https
  - public repository does not require authentication
  - private repository requires authentication
- clone via ssh
  - requires authentication but can be handled with ssh keys:
    - 1. Check your .ssh directory on IT4I for id-rsa.pub
    - 2. Add the public key to your GitHub SSH keys (Settings  $\rightarrow$  SSH and GPG keys)
    - 3. Check that it works with ssh -T git@github.com
    - 4. Clone or re-clone your private repository using ssh protocol
      - git clone git@github.com:your-githubusername/your-private-repo.git
    - 5. You should now be able to git pull without authentication
- clone via **gh CLI** 
  - GitHub command line interface

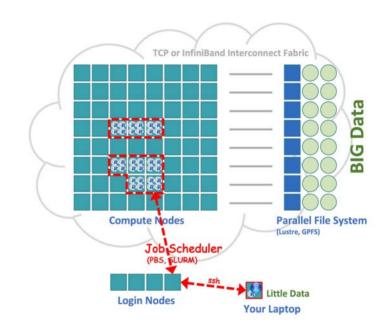
## Job Information on IT41

```
qsub your-script.sh
qstat -u your-user-id
check-pbs-jobs --check-all
```

The check-pbs-jobs gets compute node name. To monitor CPU and memory use from a login node:

```
ssh compute-node-name
top -u your-user-id
```

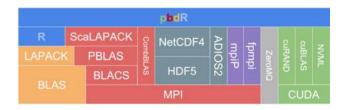
Can be done in a separate login window.



IT4I Job Management link

# Matrix Libraries ...

## R-LAPACK-BLAS



- BLAS: Basic Linear Algebra Subroutines A matrix multiplication library
  - %\*%, crossprod(), sweep(), scale(), and many more
- LAPACK: dense and banded matrix decomposition and more
  - o svd(), La.svd(), prcomp(), princomp(), qr(), solve(), chol(),
    norm(), and many more
  - But not lm(), careful with qr(x, LAPACK = TRUE): column pivoting
- Implementations: OpenBLAS, Intel MKL, Nvidia nvBLAS, Apple vecLib, AMD BLIS, Arm Performance Libraries
- **FlexiBLAS**: A BLAS and LAPACK wrapper library with runtime exchangeable backends

## **NETLIB**

Netlib is a collection of mathematical software, papers, and databases.

- netlib.org maintained at ORNL and UTK
- Contains Reference BLAS and LAPACK (v 3.10.0, June 28, 2021) Fortran libraries
  - Default BLAS and LAPACK libraries in R
- IT4I FlexiBLAS: "NETLIB" backend

Jack J Dongarra and Eric Grosse. 1987. Distribution of mathematical software via electronic mail. Commun. ACM 30, 5 (May 1987), 403–407. DOI

# **OpenBLAS**

OpenBLAS is an optimized BLAS library based on GotoBLAS2 (2010, Kazushige Goto).

- openblas.net
- Optimizes algorithm to chip architecture details such as cache size
- IT4I FlexiBLAS: "OPENBLAS" backend

Wang Qian, Zhang Xianyi, Zhang Yunquan, Qing Yi, AUGEM: Automatically Generate High Performance Dense Linear Algebra Kernels on x86 CPUs, In the International Conference for High Performance Computing, Networking, Storage and Analysis (SC'13), Denver CO, November 2013.

#### **FlexiBLAS**

flexiblas\_setup.r

```
library(flexiblas)
flexiblas_avail()
flexiblas_version()
flexiblas_current_backend()
flexiblas_list()
flexiblas_list_loaded()

setthreads = function(thr, label = "") {
   cat(label, "Setting", thr, "threads\n")
   flexiblas_set_num_threads(thr)
}
setback = function(backend, label = "") {
   cat(label, "Setting", backend, "backend\n")
   flexiblas_switch(flexiblas_load_backend(backend))
}
```

https://github.com/Enchufa2/r-flexiblas https://cran.r-project.org/package=flexiblas

#### Benchmarks with FlexiBLAS

flxiblas\_bench.r

```
source("flexiblas_setup.r")
x = matrix(rnorm(1e7), nrow = 1e4, ncol = 1e3)
memuse::howbig(1e4, 1e3)
beta = rep(1, ncol(x))
err = rnorm(nrow(x))
y = x \% *\% beta + err
data = as.data.frame(cbind(y, x))
names(data) = c("y", paste0("x", 1:ncol(x)))
elo = 0
ehi = 7
setback("NETLIB", "lm")
system.time((lm(y ~ ., data)))
setback("OPENBLAS", "lm")
for(i in elo:ehi) {
  setthreads(2^i, "lm")
  print(system.time((lm(y ~ ., data))))
```

### Benchmarks with FlexiBLAS

flxiblas\_pbs.sh

```
#!/bin/bash
#PBS -N fx
#PBS -l select=1:ncpus=128,walltime=00:50:00
#PBS -q qexp
#PBS -e fx.e
#PBS -o fx.o

cd ~/KPMS-IT4I-EX/code
pwd

module load R
echo "loaded R"

time Rscript flexiblas_bench.r
```

### Benchmarks with FlexiBLAS