## Parallel R

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# What to do if the computation is too big for a single desktop

- A common user question:
  - I have an existing R solution for my research work.
     But the data is growing too big. Now my R program runs days to finish or simply runs out of memory.
- 3 strategies
  - Move to more powerful hardware
  - Advanced libraries
  - Implement code using parallel packages



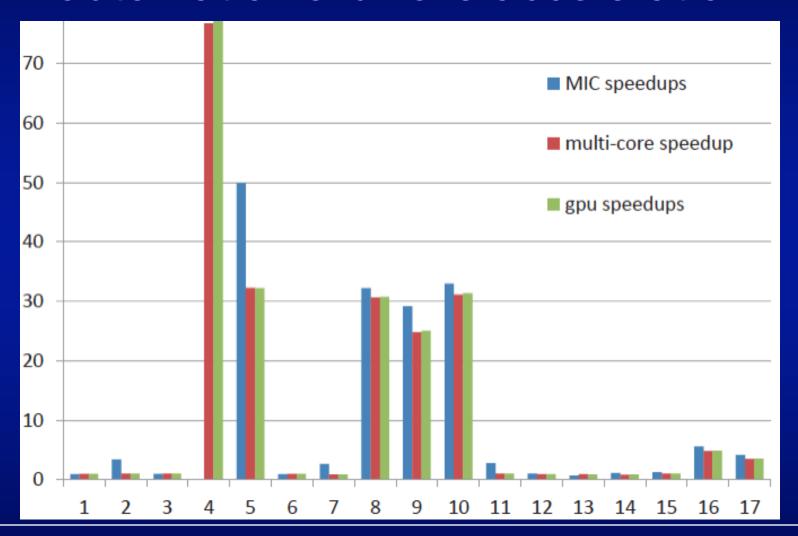
#### Intel MKL

- Rstats is compiled against Intel Math-Kernel-Library (MKL)
- Optimized calculations for:
  - –Linear algebra
  - –Fast Fourier Transforms (FFT)
  - -Neural Networks
  - Many 3rd party packages wrap C++/Fortran code that can utilize this
  - Example: Linear Regression

$$-B = (X^TX)X^TY$$



## R-2.5 benchmark performance with automatic hardware acceleration





Developed based on Rmpi package, but also supports socket connections.

Simplify the process to initialize parallel process over cluster.

While sockets are possible, must use a dirty hack to properly set your environment

Recommend using RMPISNOW instead to launch job



```
wrangler$ cat SimpleSNOW.R
library(Rmpi)
library(snow)
cluster <- getMPIcluster()</pre>
# Print the hostname for each cluster member
sayhello <- function()</pre>
    info <- Sys.info()[c("nodename", "machine")]</pre>
    paste("Hello from", info[1], "with CPU type", info[2])
names <- clusterCall(cluster, sayhello)
print(unlist(names))
# Stop cluster will also
# call mpi finalize
# no need for mpi.exit
stopCluster(cluster)
```



```
wrangler$ cat run-SNOW_Rmpi.slurm
#!/bin/bash
#SBATCH -J SNOW_Rmpi-R
#SBATCH -o SNOW Rmpi.out%j
#SBATCH -p normal
#SBATCH -t 00:30:00
#SBATCH -A TRAINING-HPC
#SBATCH -e SNOW_Rmpi.err%j
#SBATCH -N 2
#SBATCH -n 10
#set environment
module purge
module load TACC
echo "say hello"
ibrun RMPISNOW < SimpleSnow.R
echo "done"
```



wrangler\$ sbatch run-SNOW\_Rmpi.slurm

wrangler(246)\$ squeue -u train###

```
NAME
                                     USER ST
      JOBID PARTITION
                                                   TIME NODES NODELIST(REASON)
     5867739
                 normal SNOW Rmp walling CG
                                                           2 c402-[301-302]
                                                    0:13
wrangler(389)$ cat SNOW Rmpi.out5867843
> print(unlist(names))
[1] "Hello from c252-136.wrangler.tacc.utexas.edu with CPU type x86 64"
[2] "Hello from c252-136.wrangler.tacc.utexas.edu with CPU type x86 64"
[3] "Hello from c252-136.wrangler.tacc.utexas.edu with CPU type x86 64"
[4] "Hello from c252-136.wrangler.tacc.utexas.edu with CPU type x86 64"
[5] "Hello from c252-137.wrangler.tacc.utexas.edu with CPU type x86 64"
[6] "Hello from c252-137.wrangler.tacc.utexas.edu with CPU type x86 64"
[7] "Hello from c252-137.wrangler.tacc.utexas.edu with CPU type x86 64"
[8] "Hello from c252-137.wrangler.tacc.utexas.edu with CPU type x86_64"
[9] "Hello from c252-137.wrangler.tacc.utexas.edu with CPU type x86 64"
>
```



#### Memory Considerations

R pipelines often memory bound

Ex. 100 parallel tasks, each task takes 2 GB of memory, have 20 cores and and 20 GB memory -> Only utilize 10 cores at a time

Debugging/Profiling

- a. Packages: profmem, lineprof, others
- b. ssh to compute node, run 'top'



#### top

top - 08:40:20 up 100 days, 20:06, 2 users, load average: 9.45, 4.59, 3.42
Tasks: 1196 total, 98 running, 1098 sleeping, 0 stopped, 0 zombie
%Cpu(s): 72.5 us, 15.5 sy, 0.0 ni, 8.3 id, 3.6 wa, 0.0 hi, 0.0 si, 0.0 st
KiB Mem : 13161971+total, 12299456+free, 6576920 used, 2048224 buff/cache
KiB Swap: 1048572 total, 1040164 free, 8408 used. 12305089+avail Mem

PID	USER	PR	NI	VIRT	RES	SHR	S	%CPU	%MEM	TIME+	COMMAND
24422	root	20	0	0	0	0	R	100.0	0.0	144095:28	vpthread-0-1
16096	root	20	0	0	0	0	R	93.9	0.0	22402:47	vpthread-1-1
35179	walling	20	0	560420	258652	11772	S	68.0	0.2	0:05.34	R
35188	walling	20	0	560420	248208	1328	R	59.5	0.2	0:01.84	R
35191	walling	20	0	560420	248204	1324	R	58.6	0.2	0:01.81	R
35201	walling	20	0	560420	248204	1324	R	57.9	0.2	0:01.79	R
35187	walling	20	0	560420	248208	1328	R	55.7	0.2	0:01.72	R
	walling	20	0	560420	248204	1324	D	54.7	0.2	0:01.69	R
	walling	20	0		248208	1328	R	54.4	0.2	0:01.68	R
	walling	20	0	560420	248204	1324	R	53.1	0.2	0:01.64	R
	walling	20	0		248204	1324	R	52.8	0.2	0:01.63	R
	walling	20	0		248208	1328	R	52.8	0.2	0:01.63	R
	walling	20	0		248204	1324	R	52.4	0.2	0:01.62	R
	walling	20	0	560420	248204	1324	R	52.4	0.2	0:01.62	R
	walling	20	0		248204	1324		52.4	0.2	0:01.62	
	walling	20	0		248208	1328		52.1		0:01.61	R
	walling	20	0		248204	1324		51.8	0.2	0:01.60	
	walling	20	0		248204	1324		51.8	0.2	0:01.60	R
	walling	20	0		248204	1324		51.5	0.2	0:01.59	
	walling	20	0		248204	1324		51.1	0.2	0:01.58	
	walling	20	0		248204	1324		51.1	0.2	0:01.58	
	walling	20	0		248204	1324		51.1	0.2	0:01.58	
35225	walling	20	0	560420	248208	1328	R	50.5	0.2	0:01.56	R

