## Homework 11. Due by 5pm on Thursday 11/12. Parallel statistical computing.

All modern computers, from a basic laptop to a node on a computing cluster, have multiple cores. Parallelizing your code (i.e., taking advantage of multiple cores) can enable computations too large for one core. Write brief answers to the following questions, by editing the tex file available at https://github.com/ionides/810f20, and submit the resulting pdf file via Canvas.

1. Trends in statistical computing are driven by trends in hardware. Why is this leading to a growing role for parallel computing?

https://en.wikipedia.org/wiki/Parallel\_computing YOUR ANSWER HERE.

2. Some key terms for parallel computing are: process, thread, core, node. Briefly define these in your own words.

```
https://en.wikipedia.org/wiki/Parallel_computing
YOUR ANSWER HERE.
```

- 3. What common statistical computing tasks are embarassingly parallel? https://en.wikipedia.org/wiki/Embarrassingly\_parallel YOUR ANSWER HERE.
- 4. A basic tool for embarassingly parallel computing in R is foreach. This is now part of the doParallel library included in base R. Run the following R codes for generating 10<sup>8</sup> standard normal random variables, on your laptop or some other machine. These run in a few seconds on my laptop, but that is fairly new. If 10<sup>8</sup> is too tedious on your machine, make appropriate changes. Explain the relative speeds. The "elapsed" component of the run time is the total time, in seconds, and is the primary outcome of interest. If you like, you can read more about foreach at

https://cran.r-project.org/web/packages/foreach/vignettes/foreach.html

```
library(doParallel)
registerDoParallel()
system.time(
  rnorm(10^8)
) -> time0
system.time(
```

```
foreach(i=1:10) %dopar% rnorm(10^7)
) -> time1
system.time(
  foreach(i=1:10^2) %dopar% rnorm(10^6)
) -> time2
system.time(
  foreach(i=1:10^3) %dopar% rnorm(10^5)
) -> time3
system.time(
  foreach(i=1:10^4) %dopar% rnorm(10^4)
) -> time4
rbind(time0,time1,time2,time3,time4)
```

## YOUR ANSWER HERE.

5. Can you think of common statistical computing tasks that would benefit greatly from using simple parallelization such as foreach?

YOUR ANSWER HERE.

- 6. Once you are using multicore computing on your laptop or desktop, the next step for additional computing resources is greatlakes (https://arc-ts.umich.edu/greatlakes/). Describe briefly any previous experience you have had with computing on a cluster. YOUR ANSWER HERE.
- 7. A popular data science parallel computing approach is Hadoop with MapReduce (https://en.wikipedia.org/wiki/Apache\_Hadoop). Do you have suggestions on what parallel statistical computing tasks are more appropriate for Hadoop than for foreach?

YOUR ANSWER HERE.