This problem set will provide an opportunity for you to continue practicing with the command line and executing batch jobs on the OSCER cluster. You will also get practice importing data and working in Spark.

As with the previous problem sets, you will submit this problem set by pushing the document to *your* (private) fork of the class repository. You will put this and all other problem sets in the path /DScourseS21/ProblemSets/PS4/ and name the file PS4_LastName.*. Your OSCER home directory and GitHub repository should be perfectly in sync, such that I should be able to find these materials by looking in either place. Your directory should contain four files:

- PS4a_LastName.R (first R exercise; though you can also do this in Python or Julia if you prefer)
- PS4b_LastName.R (sparkR exercise)
- PS4 LastName.tex
- PS4_LastName.pdf
- 1. Log in to OSCER, change to the directory where you cloned your forked GitHub repository (probably ~/DScourseS21), and make sure the OSCER version of your repository is synchronized with what is listed on GitHub by issuing a pull. That is, type git pull origin master from your OSCER DScourseS21 folder.
- 2. Synchronize your fork with the class repository by doing a git fetch upstream and then merging the resulting branch.
 - Before doing this, make sure that you have set your default git text editor to Nano (and not Vim) by typing the following at the command line: git config --global core.editor "nano"

Making your SLURM job scripts visible from any directory

3. In class last week, you practiced running simple R or Python scripts on the OSCER cluster using the Rbatch, Pythonbatch, and juliabatch scripts located in the SLURM/ folder of our course GitHub repository. Recall that the syntax for these commands was (assuming you are in the SLURM/ directory): ./Rbatch rscript.R rscriptoutput.log 1:00 my-email@address.com, where the "1:00" argument is a number indicating how long the job should run for.

Now, I'd like you to move these files to a place in your OSCER directory tree where they can be executed from *any* folder (not just the SLURM/ folder). To do so, follow these steps:

- 1. Change to your home directory: cd ~
- 2. Create a new directory called bin/by typing mkdir bin
- 3. Copy the *batch files from your SLURM/ folder to the ~/bin/ folder using cp.
- 4. Change to the bin/ folder and do a listing and make sure that the files copied successfully, and that they are executable (the filenames should be colored green).¹
- 5. Go back to your home folder (cd ~) and type which Rbatch. It should return with ~/bin/Rbatch. Now you can execute the Rbatch script from wherever you are on OSCER!²
 - (a) Note that, when executing these scripts from now on, you don't need to prepend them with "./" because "./" is telling Linux to execute the file that's in the current directory. So in the future, execute these scripts by simply typing Rbatch myfile.R and not ./Rbatch myfile.R.

Making Spark executables visible from any directory

4. This follows a bit on the previous question. What you will now do is edit your ~/.bash_profile file to make it so you can simply type sparkR or pyspark to automatically open the Spark API of your choice.

To do this, open in nano the .bash_profile file which is located in your home directory.

Near the bottom of the file, you should see the phrase EXPORT PATH. Just above this line, type module load Spark/2.0.0. Save and close the file, and then log out of OSCER.

Once you've logged back in to OSCER, verify that your modification worked by typing which sparkR at the command line. The command prompt should reply with a long file path.

Type sparkR at the command line and you should be able to use Spark's R API.

¹If they are not green, issue a chmod 774 filename command on each file.

²For those curious about what's going on "under the hood," there is a Linux variable called \$PATH which tells the system where to look for executable files. This \$PATH variable is loaded whenever you log in because it is contained in the file ~/.bash_profile. By making changes to your .bash_profile file, you can change your login environment without having to repeat commands every time you log in.

Practice with JSON files (R exercise part 1)

- 5. This question will help you get comfortable working with (and converting from) JSON data, which is the most common data format for APIs that house web data.
 - (a) Download the following file from within R, Python, or Julia: http://api.fantasy.nfl.com/v1/players/stats?statType=seasonStats&season=2010&week=1&format=json
 The way to do this is to call wget (which is a system command) from inside
 R/Python/Julia. Note that we want to specify the local name of this file (call
 it nfl.json). To do that, we say wget -0 filename.extension "urlpath" (note:
 that's a letter O, not a number 0; also pay attention to the quotation marks).
 - R sytnax is: system("linux shell command")
 - Python sytnax is: call(["linux", "shell", "command"])³
 - Julia sytnax is: run(`linux shell command`)
 - (b) Now print your file to the console by typing cat nflstats.json (or whatever you choose to name the file) within the system call.
 - (c) This file is ugly, so let's make it a little easier to deal with by converting it to a data frame.
 - If you use R, you will need to call the library jsonlite. You may need to install it first. The code to convert to a dataframe is mydf <- from JSON('nflstats.json'). (Make sure you call the file by whatever you called it in part (b).)
 - (d) Check what type of object mydf is. What type of an object is mydf\$players?
 - In R, this is done with class().
 - In Python, this is class().
 - In Julia, this is typeof().
 - (e) List the first *n* rows of the players dataframe.
 - (f) Put all of these commands into an R, Python, or Julia script and then run it from your PS4/ directory using Rbatch, Pythonbatch, or juliabatch. Remember the correct syntax which is listed in Question 3 of this homework.

What I wanted you to take away from this exercise is that there is no one-to-one mapping from JSON/YAML files to tabular data. So creating a tabular data frame from a JSON requires a little extra work. The same holds true for other data types like XML and HTML (though these may be closer to a one-to-one tabular representation).

³This requires the call function from the import library. Also note that spaces in the command need to be in separate strings.

Also, note that the from JSON and other functions can accet a URL as an argument. I had you use the shell just so you can get comfortable with accessing the shell from within R/Julia/Python.

Practice with SparkR (R exercise part 2)

- 6. This exercise will familiarize yourself with SparkR and how it is similar to or different from regular R. Please do the following. While you're entering these commands at the interactive SparkR prompt, you should also be creating an R script called PS4b LastName.R which contains all of these commands (so that you could easily reproduce your work whenever called upon).
 - 1. Open a SparkR session on OSCER by typing sparkR at the command prompt.
 - 2. Create a dataframe called df1 that loads in the iris data.⁴
 - 3. Now create a SparkDataFrame called df which loads in the iris data. The command for this is createDataFrame.
 - 4. Verify that the two dataframe are different types: type class(df1) and class(df). What is the class of each?
 - 5. Next, we will apply the common RDD/SQL operation: select
 - (a) List the first 6 rows of the Sepal_Length and Species columns of df. This can be done by typing head(select(df, df\$Sepal_Length, df\$Species)).
 - (b) If you try the previous command on df1, what happens? Why do you think that happened?
 - 6. Now let's do another common RDD operation: filter
 - (a) List the first 6 rows of all columns of df where Sepal_Length is larger than 5.5. This can be done by typing head(filter(df, df\$Sepal_Length>5.5)).
 - (b) If you again try the previous command on df1, what happens? Why do you think that happened?
 - 7. Combine the two previous exercises into one line (that is, nest the select and filter operations into one line.
 - 8. Another useful RDD operation is "group_by" which in SparkR is called groupBy. We can compute the average sepal length, as well as the number of observations, by each of the three iris species: head(summarize(groupBy(df, df\$Species), mean=mean(df\$Sepal_Length), count=n(df\$Sepal_Length))).

⁴Hint: use the command as.data.frame().

- 7. Go to www.overleaf.com and create another.tex document, this time naming it PS4_LastName.tex. In it, tell me about some data sources that you would be interested in scraping from. These could be, for example: classical texts from Project Gutenberg, tweets that include a particular hashtag, college or professional sports statistics, financial market data, etc. For anything you are interested in, there is almost surely data that is freely available on the internet, and most data sources come with highly accessible APIs for R or Python.
 - In another part of your .tex file, answer the questions raised in the various parts of the previous question.
- 8. Compile your .tex file, download the PDF and .tex file, and transfer it to your cloned repository on OSCER using your SFTP client of choice (or via scp from your laptop terminal). You may also copy and paste your .tex file from your browser directly into your terminal via nano if you prefer, but you will need to use SFTP or scp to transer the PDF.⁵
- 9. You should turn in the following files: .tex, .pdf, and two .R scripts. Make sure that these files each have the correct naming convention (see top of this problem set for directions) and are located in the correct directory (i.e. ~/DScourseS21/ProblemSets/PS4).
- 10. Synchronize your local git repository (in your OSCER home directory) with your GitHub fork by using the commands in Problem Set 2 (i.e. git add, git commit—m "message", and git push origin master). Once you have done this, issue a git pull from the location of your other local git repository (e.g. on your personal computer). Verify that the PS4 files appear in the appropriate place in your other local repository.

⁵If you want to try out something new, you can compile your .tex file on OSCER by typing pdflatex myfile.tex at the command prompt of the appropriate directory. This will create the PDF directly on OSCER, removing the requirement to use SFTP or scp to move the file over.