Northwestern EECS 213 SETI Lab Spring 2015

The Search for Extraterrestrial Intelligence (SETI) is a long-standing international effort to try to find alien civilizations (yes, little green men) through their radio wave (and more recently, optical) emissions. An inhabited planet like ours is as bright as a small star in the radio spectrum due to humanity's numerous radio transmitters, from big AM, FM, shortwave, and TV stations all the way down to the tiny transmitters used by computers and phones to connect to WiFi and cellular access points. We make full use of this spectrum to communicate with one another. One of the basic (and fairly naïve) assumptions of early SETI efforts was that this would hold true for other intelligent civilizations. They may, in fact, communicate using technology built on wild physics that we don't yet understand. But for now, we'll have to see what we can uncover with radio waves.

SETI uses antennas generally employed for radio astronomy to "look" at other stars, recording *signals* over an interval of time. Unlike a regular radio receiver, these receivers do not *tune* to a specific frequency, but rather listen on many frequencies at once—they are *broadband*¹ receivers. They also do not try to decode or *demodulate* the signals they receive at all. The point is to produce huge amounts of signal data. The signal data contains not only possible alien signals, but also many human signals, and a lot of noise from all kinds of natural radio sources (e.g. the supermassive black hole at the center of our galaxy).

The signal data from the radio telescopes is analyzed with computer programs that use *signal processing* algorithms, which sift through the data looking for artificial signals that do not come from our own planet. This is a huge computational (and conceptual) challenge, and a significant breakthrough came with the SETI@HOME project², which allowed ordinary people to volunteer their computers to participate in a large-scale, distributed version of these programs. Currently, there are over 1.3 million registered users whose computers contribute an average of about two thousand trillion floating point operations per second to the effort (2 *PetaFLOPS!*).

In this lab, you will tackle a greatly simplified and constrained version of this computation, with the goal of trying to make our class server (or other computers you'd like to try) execute the computation as fast as it can³. You will write a program that, given a raw signal from a broadband receiver, will try to hunt for signs of intelligence⁴ within it, specifically some kind of message. Your program will determine whether a given *frequency band* has unusually high power, and if so, which band it is in. In addition,

¹ They're broadband receivers, but we actually search for *narrow-band* signals in the analysis stage

² http://setiathome.berkeley.edu/

³ This kind of task, i.e. taking an existing, computationally intensive program, and making it faster with smart programming, is referred to as *performance optimization*.

⁴ What would actually constitute *intelligent* information content is a topic of ongoing research!

your program will use another program that we provide to determine whether that high-power signal actually appears to come from an *intelligent* source. For fun, we will give you some other programs, an *AM demodulator* and an audio converter, which given the signal and the band, will convert the signal to audio format and let you hear it. The AM demodulator is basically a simple AM radio, and your program will tell us how to tune it.

Of course, this is a systems course, so our focus won't be on the aliens or the signal processing. The goals of the lab are

- to get you to think about what goes into making a simple parallel algorithm,
- to expose you to low-level parallel programming on a shared memory machine using pthreads,
- to expose you to the Unix I/O programming interface, and
- to expose you to the effects of compiler optimization.

The specific algorithm you'll be using also allows you to control how much computation is done per memory read or write, letting you see the effects of the *memory mountain*.

While evaluation of this lab will be done using our server hanlon.wot.eecs.northwestern.edu, which has 40 processors, the lab can also be compiled and tested on the Intel Xeon Phi, a parallel co-processor with over 220 processors. Playing with the Phi is an optional part of this lab.

Logistics

This lab can be done in teams of two people.

To start, grab a copy of ~cs213/HANDOUT/setilab-handout.tar, untar it in your protected working directory. You will find the following elements:

- README describes any last minute details
- Makefile
- Generation and Playback Programs
 - o siggen this binary program will generate a signal for you to look at.
 - o amdemod this binary program will demodulate the signal and create an audio signal in a binary format
 - o bin2wav this binary program will translate the audio signal to a WAV file, which can be played back with any media player.
 - analyze_signal this program looks for "information content" of your signal, i.e. language.
- Signal and Filtering Code
 - signal.[ch] load an store signal files in several ways, including text I/O using the stdio system, binary I/O using the Unix open/seek/read/write/close system call interface, and binary I/O using the Unix mmap system call interface.
 - filter.[ch] generate filters and apply them to signals (sequential only)
 - o timing.[ch] find out how long things take using various methods

- band scan.c a sequential version of the program you'll write
- Pthread examples
 - o pthread-ex.c how to create and use threads on Unix (and most platforms)]
 - o parallel-sum-ex.c-how to compute the sum of an array in parallel
- seti-eval allows you to evaluate your program and compare it to others via the web site.
- p band scan example.job an example job submission file for use with the Phi.

In this lab, you will develop the program **p_band_scan.c**, which is a parallel version of band_scan.c. p_band_scan.c should behave identically to band_scan.c, except that it will allow you to vary the number of processors used to compute the solution, making the time to solution faster. Your p_band_scan.c must be correct and it should be performance competitive with our implementation.

For this lab, you should use generally murphy.wot.eecs.northwestern.edu, or some other machine (Tlab and Wilk Lab machines will work) for development. **We will reserve**hanlon.wot.eecs.northwestern.edu for evaluation, and for students interested in the Phi.

Your first task is to get some signal data from our server. If this were actually SETI@Home, this would be real radio telescope data made available via a project server. For this lab, we've set up a system that generates virtual signals, akin to what you might see if you pointed a radio telescope out into space.

Where SETI@Home looks for signals in a 2.5 MHz⁵ frequency band, we are giving you signals in a 200 KHz frequency band to make things more tractable. The signals comprise roughly 30 seconds of data. Typically, these radio signals would be subject to the Earth's rotation. However, to simplify things for you, we will ignore this effect. You can assume that your signal was recorded while the radio telescope was stationary and pointing at a fixed patch of sky.⁶

To get your signal, run the siggen binary we provide:

Murphy> ./siggen —n netid1-netid2

This will take some time, and it will give you several, custom virtual signals. Only one of these will contain an alien message. Other signals may just contain local interference or old radio transmissions. Each signal will be in 'sig-N.bin', where N will go from 0 to however many signals we decide to give you. You will also receive a file named 'secret' that contains a secret key that will be used during submission for authenticating you to our server.

⁵ The choice of this frequency band is not arbitrary. It's centered around the *Hydrogen line*.

⁶ Some astronomers now think this may actually be the right way to go—more telescopes, each dedicated to its own, fixed patch of the sky. The energy required to transmit a signal of significant power over several light years may be too much for an "always on" beacon that a directional sweep is intended to pick up.

You may modify any of the files in the handout directory, except the generation and playback programs, and you can add new files as needed. You can compile band_scan.c, and then use it to test out how things work:

```
Murphy> make
Murphy> ./band_scan
usage: band scan text|bin|mmap signal file Fs filter order num bands
```

Here, the "text|bin|mmap" argument indicates how the signal_file is to be interpreted. Fs, filter_order, and num_bands relate to the problem, and will be given to you. We will describe them a bit later. For the purposes of this lab, you can assume that Fs will always be 400,000 (400 KHz).

If you run band scan on a signal that has an alien, it will say something like this:

POSSIBLE ALIENS 80000.000100-120000.000100 HZ (CENTER 100000.000000 HZ)

```
Murphy> ./band scan bin sig.bin 400000 32 10
type:
        Binary
file:
        sig.bin
Fs:
        400000.000000 Hz
order:
bands:
        10
Load or map file
Read 11999489 samples
signal average power:
                      0.336757
               0.000100 to
                                 19999.999900 Hz:
                                                          0.002624 **(meh)
           20000.000100 to
                                 39999.999900 Hz:
                                                          0.000108 *(meh)
                               59999.999900 Hz:
           40000.000100 to
                                                          0.000060*(meh)
           60000.000100 to
                               79999.999900 Hz:
99999.999900 Hz:
                                                          0.000061 *(meh)
           80000.000100 to
                                                          100000.000100 to
                                119999.999900 Hz:
                                                          0.081501 *********************************(WOW)
                               139999.999900 Hz:
          120000.000100 to
                                                          0.000042 *(meh)
          140000.000100 to
                               159999.999900 Hz:
                                                          0.000023 *(meh)
                                                          0.000017 *(meh)
           160000.000100 to
                                179999.999900 Hz:
                                                          0.000019 *(meh)
          180000,000100 to
                               199999.999900 Hz:
<detailed timing information>
Analysis took 10.719594 seconds
```

This result means that there is an unusual amount of power centered around the radio frequency 100,000 Hz (100 KHz) in this signal. This may be an alien! If you run against the example file ~cs213/HANDOUT/noalien.sig, you'll see what a more boring signal looks like. If you run against the example file ~cs213/HANDOUT/alien_msg.sig, you'll see what an alien signal looks like.

NOTE: We've checked with our scientists, and they tell us that, for the purpose of this lab, aliens will almost certainly be transmitting on frequencies between 50KHz and 150KHz, so if you see some power outside of this band it, it is likely noise or interference and is safe to ignore.

If you've detected a large amount of power in a narrow band, you might just have an alien message. To further verify this, you can see if it has something that might be akin to language by using this program:

```
Murphy> ./analyze signal -p sig.bin
```

The —p option tells it to print out high-powered pulse lengths it found in the signal, and is optional. Do you notice anything special about the pulse lengths you find? If it found something very interesting, it will output the following:

```
The information content of this signal appears to be very high!
```

At this point we can pretty much assume we have an alien message on our hands. Make sure to take not of which signal this is. I.e. if this was sig-0.bin and it had a message, you will need to provide 0 to the handin program.

You can then decode the signal for audio playback:

```
Murphy> ./amdemod -c 100000 sig.bin
```

Here, the "100000" is the center of the "possible aliens" band you detected using band_scan. amdemod will produce the output file sig.out. You can then convert sig.out to a WAV file:

```
Murphy> ./bin2wav sig.out
```

This will produce the file out. way, which you can play to hear what your alien sounds like.

Your parallel implementation of band scan will look like this:

The two additional arguments denote the number of threads and the number of processors you are to use (processors 0 to num_processors-1). You should round-robin your threads over the processors as a starting point.

The line of the output ("POSSIBLE ALIENS 80000...") is critical – it is how the testing and grading system finds your answer. Your program needs to match the format that band_scan uses exactly.

When you are ready to compare your implementation to others, you can use our evaluation script, like this (don't forget to include your secret with the –k flag):

```
Murphy> ./seti-eval -t team_name -n netid1-netid2 -s ./p_band_scan -k secret -a 0
```

Where 0 is the signal number corresponding to the alien I found. It may take some time for this to complete. This will update the following dashboard:

http://murphy.wot.eecs.northwestern.edu/~cs213/setilab-dashboard.html

Only team names will appear on the dashboard. Your entry will show up with additional information:

A WAV file you can click on to hear result

- An analysis of roughly how fast your program was, reported as a scalability graph (more information later) that compares your program with our baseline implementation.
- A ranking of your performance compared to us (we are 1.0) and to other participants
- A note of whether you found the alien or not

Note that the evaluation process may take some time—we may run your program with several different signals, filter orders, numbers of bands, numbers of threads, and numbers of processors to produce the report.

You can submit as many times as you want and try out different implementations to see just how fast you can make this process go.

When you are ready to hand in your work for grading, run

```
Murphy> ~cs213/HANDOUT/seti-handin -t team_name -n netid1-netid2 -k secret -a
```

This will take a snapshot of your directory and run the seti-eval program. Only source files (.c and .h) and Makefiles will be copied, not binaries.

Signal processing in this lab

For the purposes of this lab, a signal is an N element array of double precision floating point numbers, where each number indicates the level of the signal (the intensity of the induced current in the antenna) at a given point in time. A signal like this is more specifically termed a discrete-time signal (from electrical engineering), and is also known as a time series (from statistics). Our discrete-time signals are periodically sampled, meaning that the time between one sample and the next is fixed. The inverse of this sample time is called the sample rate, and it is the "Fs" in the above. To make this more concrete, suppose we have a sequence of numbers like this in the signal file:

0.03

0.50

-0.2

-0.9

-0.6 0.3

Let's suppose that the first value (0.03) arrived at time 0, and further suppose the sample rate (Fs) is 1000 per second (or 1000 Hz, or 1 KHz). This means the second value (0.50) arrived at time 0+1/1000 = 0.001 = 1 ms, the next (-0.2) at 2 ms, and so on.

A neat fact of signal processing is that any signal can be represented as a sum of shifted, amplified sine waves at specific frequencies (keyword: Fourier). We can think of the signal as being composed of different "amounts" (amplitudes) of these sine waves, which is essentially what the band_scan program computes. Each band consists of a group of sine waves. For reasons not important here

(keyword: Nyquist), the highest frequency such sine wave we can find is half the frequency of the sample rate, so 500 Hz in the above example.

Now you can better understand what band_scan is doing, since you know the Fs that was used (400 KHz), and that resulted in being able to look from 0 Hz to 200 KHz. We asked it to look at the sine waves in that range in 10 bins or bands (0 to 20 KHz, 20 to 40 KHz, and so on). It then found a lot of power (meaning high amplitude sines) around 100 KHz.

band_scan does its work by applying band pass filters. A band pass filter passes through sine waves that are in a range of frequencies (the band), and rejects others.

If you look at band_scan.c, you'll see that for each band of interest, it first generates a filter design. This form of filter is the simplest variety – it looks like another signal in that it's just an array of M doubles, where M=filter_order+1. The bigger M (filter_order) is, the better the filter is, but the more expensive it is to use. Unless M is truly huge, the time spent in generating the filter is negligible.

Once the filter for the band has been generated, band_scan.c next applies it to the signal using a small function called convolve_and_compute_power().

convolve_and_compute_power() is the function that does the heavy lifting (keyword: convolution). You can easily read the function's code to see what it does, but here is the challenge: if the filter is of size M and the signal of since N, then convolve_and_compute_power() does O(N*M) work. As convolve_and_compute_power() executes, it also sums up the power in the selected band of the output signal, which is an additional O(N) work. Once all the bands are completed, the band-sums are evaluated using thresholds to see if there is something interesting to be found. This takes negligible work. Therefore, if you are asked to use B bands, the whole program does O(B*N*M) work.

Parallelizing the signal processing

Your goal is to do the O(B*N*M) work in less than O(B*N*M) time. Ideally, if you have P processors, you would be able to do it in O(B*N*M/P) time. You may be able to achieve this in some cases. For different values of B, N, M, and P, you may find there are different challenges to achieving high performance. For example, you may be bottlenecked by I/O, just reading/writing the files, or by the CPU, or by the memory system.

Parallelism requires not just that you have the ability to do multiple things at once, but also that no intrinsic ordering or dependencies in the algorithm are violated. If you violate them, the result may be incorrect. Correct and slow is better than fast and wrong, so be careful. So, you are looking at the work to find out what chunks you can correctly do together.

There are at least three independent ways to parallelize band_scan that we can think of, plus the algorithm could be changed (see extra credit). You are welcome to try out any approach you think might be interesting. **The one approach you definitely will want to try first, however,**

is simply to execute bands simultaneously, that is, to parallelize across the bands. That should be sufficient for achieving the basic learning and performance goals of the lab.

When we think of the performance of a parallel program, we need to think beyond just the basic runtime for an example. In particular, we are also interested in how the program *scales* with the problem size and with the number of processors. In a perfectly scalable program, we can always double the number of processors and expect the execution time to be cut in half. Very few parallel programs work this way. In fact, if they do, they are usually called *embarrassingly parallel*. A good performance measurement of band_scan would look at the execution time as a function of (1) the number of processors (P), (2) the signal size (N), and (3) the size of filter (M). Another useful view is called a *speedup curve*, where we fix the problem size (N and M), and vary the number of processors, plotting time-with-1-processor / time-with-P-processors as a function of P. This is the view we will use for reporting results on the web page, and for grading.

Hanlon has two processors, each of which has 10 cores, and each core has two hardware threads.⁷ For the purposes of this section, *hardware thread* means processor. This means that it can effectively do 2*10*2 = 40 things at once, so we would not expect speedup beyond P=40.

Two other ways you might find it possible to get better raw performance and/or better speedup include:

- Parallelizing the individual convolutions themselves. If you look at the
 convolve_and_compute_power() function, you'll see that it does O(M) work for each of the N
 output data points. You could work on those data points in parallel instead of, or in addition to
 working in parallel across the bands.
- Exploring the impact of different compiler optimizations to increase the performance of the convolve_and_compute_power() function.

 7 The use of the terms processor, core, hardware thread, software thread (pthread), and process can be a bit

confusing. Here is what it means. A machine may have one or more processors. Each processor is a separate chip mounted on the motherboard of the machine. The processors share the main memory system (DRAMs), although each processor can access memory *near* it faster. A processor can have one or more cores. A core is a complete execution unit plus one or more levels of memory cache. Each core can independently fetch, decode, and execute instructions. Usually, the cores of a processor share an L2 or L3 cache. Each core may have one or more hardware threads. A hardware thread (*hyperthread* is what Intel likes to call this) consists of hardware that can fetch and decode instructions. All the hardware threads of a core share the single execution engine of the core. Their purpose is basically to keep that engine busy by feeding it work. The operating system creates the abstraction of software threads, which are the pthreads you will program in this lab. The OS dynamically maps software threads onto hardware threads. You can ask that it maps a software thread to specific hardware thread on a specific core on a specific processor. The OS also creates the abstraction of processes, which contain one or more software threads running in a shared memory space. These processes are accessed by the programmer through fork/wait and similar system calls. The OS implements processes using both software threads and virtual memory management, both of which are tightly coupled with the hardware. In addition, some programming

languages (e.g., Scheme, some Java implementations, etc) implement another level of threads and processes on

top of the operating system supplied software threads (pthreads) and processes.

Regular Unix I/O and memory-mapped I/O

You will need to read the binary input signal file. Although code is provided in signal.c to do this, you may want to review it to understand what it's doing, and to better choose between the three techniques offered there. The code supports text-based files using the C stdio library (available wherever C is available), regular Unix I/O, and memory mapped Unix I/O. Regular I/O consists of the use of the Unix system calls open, read, write, Iseek, and close. You can learn much more about regular I/O in the book, and in the handout *Unix Systems Programming In A Nutshell*, available on the web page. The main idea is that regular I/O is explicit—you need to tell the operating system exactly what to do and when to do it using the system calls.

In memory-mapped I/O, we ask the operating system (via the mmap system call) to map the file into our address space so that we can treat it like a chunk of data in memory. Recall that in execing a program, the operating system memory maps portions of the executable program file into the address space and then jumps to it. The mmap system call gives us access to the same functionality. Memory-mapped I/O is implicit—you just read and write memory, and the operating system translates that into actual I/O as needed.

Pthreads and processor affinity

You will need to partition the work among multiple processors. To do this, you will use threads, which are explained in some detail in your book. In Linux, the threading interface is called *pthreads*.

The file pthread-ex.c shows how to use the basic pthread system calls. It is very important that you supply the —pthread option to gcc when compiling code that uses pthreads (see the Makefile). The pthread_create system call creates a new thread that starts executing in the function you specify. That is, it looks like a function call, but the caller does not wait for the callee to finish! Instead, the caller and callee continue to run simultaneously. The caller can explicitly wait for the callee to finish by using the pthread join system call.

Note that this is quite similar to the fork and wait system calls discussed in more detail in class, the book, and the systems programming handout. However, while fork creates an entirely new process that is an independent clone of the parent process, pthread_create creates a new thread of execution (that starts at the callee function) within the current process. The new thread of execution shares all the memory and other state of the current process with the thread that created it, and with all of the other threads in the process. This means they must carefully coordinate access to the shared memory to avoid serious and difficult to track down bugs. While this is extremely challenging, it is outside the scope of this lab. In this lab, your threads only need to read from shared memory (the input signal). Their writes to the output signal do not need to overlap.

You can create as many threads as you want (and that the operating system has memory to track). The operating system will interleave the execution of these threads in time and across the processors available on the system. That is, the operating system can switch from thread to thread on any given processor, and it can move a thread from one processor to another. This scheduling activity happens on

the order of every millisecond or so. It does this to "balance the load" and to maintain fairness among all the threads in the system. However, it is sometimes convenient, especially in a parallel program, to directly control which processor a thread runs on. This is known as processor affinity. A thread can advise the operating system of the set of processors it would like to be run on. The pthread-ex.c example shows how a thread can request that it only run on a specific processor.

The parallel-sum-ex.c example shows how to use pthreads to sum up an array of doubles in parallel.

Measuring time, performance, and resource usage

The lab code timing. [ch] includes three timing tools. The band_scan.c code uses them to measure its own activity. You can use them to find out what the bottlenecks are in your code.

The first timing tool, get_seconds(), is measuring the passage of real time using the Unix gettimeofday() system call. This can be used arbitrarily in any thread since there is exactly one time across the whole system.

The second timing tool, <code>get_cycle_count()</code>, is measuring the passage of real time using the processor cycle counter. This is the most accurate measurement, but it's important to note that each core has its own cycle counter, which can make for confusion if a thread migrates from one core to another.

The third timing tool, <code>get_resources()</code>, measures resource usage, including time spent using the processor. You can measure the resource usage of your entire process, and of individual threads. This mechanism gives highly detailed information, but the resolution is much lower than the other timing tools.

What to do

Here is a suggested approach to this lab. **Don't panic!** Remember that what you're doing here is writing p_band_scan.c. There is a lot of complexity in this overall system, but you are not writing it from scratch – you're just parallelizing this component of it. Our own reference implementation of p_band_scan.c is based on band_scan.c and consists of only about 180 additional lines of C. Ask questions and get help.

- 1. Read and play with the handout code to get a good sense of how things work. Make sure you try both the "alien_msg.sig" and "noalien.sig" signals, and to get your own signals using siggen.
- 2. Read through band_scan.c and filter.c, focusing specifically on the analyze_signal() and convolve_and_compute_power() functions, which do the main work.

- 3. Understand the pthread-ex.c and parallel-sum-ex.c code. Start by just compiling it and running it, and then look at it more carefully. parallel-sum-ex.c shows how to sum up the elements of an array in parallel.
- 4. Develop a strategy to parallelize the band_scan processing. Read the section on this carefully.
- 5. Implement your design of p_band_scan using pthreads. It must be possible to specify how many threads to use and how many processors to use at run-time.
- 6. Test your program to make sure it is correct (compare against the sequential band_scan program).
- 7. When it's correct, start participating in the competition using the seti-eval script and the web site.
- 8. Instrument your program with the timing and resource measurement tools so that it reports the time taken to read the signal, read the kernel, do the analysis, as well as the total time it takes.
- 9. Try to enhance performance based on your instrumentation and other ideas you can get extra credit if your performance exceeds that of our reference implementation.
- 10. Do some other extra credit if you have the time, and it looks interesting.

Grading criteria

Your lab will be graded based on three criteria

- 30% Correctness it should give the same answers as the sequential band_scan program, and you should identify the correct signal as containing the alien message
- 60% Performance it should perform similarly to our simple parallel implementation. This is curve "TAs" curve in the performance graph shown on the dashboard.
- 10% Code quality your program should be coherent

For performance grading, we will use the performance graph seen in the dashboard. As long as your curve is within 10% of our simple implementation's curve, you will get full performance credit.

If your implementation is slower, you will lose 10% of the performance points for every 25% it is slower.

Please note that our implementation is very simple and unoptimized, and should therefore be easy to match or beat.

Extra Credit

If your implementation is faster than our baseline parallel implementation (whose performance you'll be able to see on the web site), you'll receive extra credit, up to a maximum of 20% more for an implementation that's twice as fast as ours.

If this lab is easy for you, and you'd like more of a challenge, we'd be happy to talk to you about some of the following options:

- Using the Intel/AMD SSE or AVX vector instructions or other special instructions to get parallelism within a single thread of execution. Vector instructions operate on lots of data at once. To implement this, you will probably need to learn about inline assembly.
- Investigate compiler optimizations, including those that are specific to the machine you are running on. See if the compiler can improve performance for you. gcc has hundreds of optimization features you can enable/disable from the command line.
- Evaluate on an Intel Phi. Hanlon has an Intel Xeon Phi 3120A you can play with. You can compile the lab for the Phi in the following way. This will only work on hanlon:

```
Hanlon> make clean
Hanlon> make TARGET=phi
```

You can then edit the file p_band_scan_example.job to set up your run, and then submit your job like:

```
Hanlon> ~cs213/HANDOUT/phi-submit.pl p band scan example.job
```

You can also switch from using gcc to using Intel compiler for the phi (icc). icc is able to make use of the vector features of the Phi.

• Implement on a GPU. Hanlon has an NVIDIA K20C GPU you can play with. You can make the CUDA development environment via:

```
Hanlon> source ~cs213/HANDOUT/cuda env
```

- Implement convolution through FFT. This is an alternative algorithm to the one given in the example code that is asymptotically much better. However, to make it parallel, you would have to figure out a parallel FFT transform.
- Implement the band_scan as a parallel filter bank. This is another potential way to improve the algorithm of the problem and possibly its performance.
- We have a few other ideas, so let us know if you are interested

If you decide to pursue any of these, please talk to us first so we can give you guidance or possibly specialized hardware access. Your best bet is to finish the main part of the lab first, with good performance. Then consider extra credit.