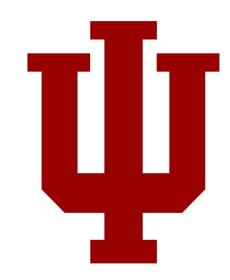
# Introduction

Engr 315: Hardware / Software Codesign Andrew Lukefahr Indiana University



### Course Website

# engr315.github.io

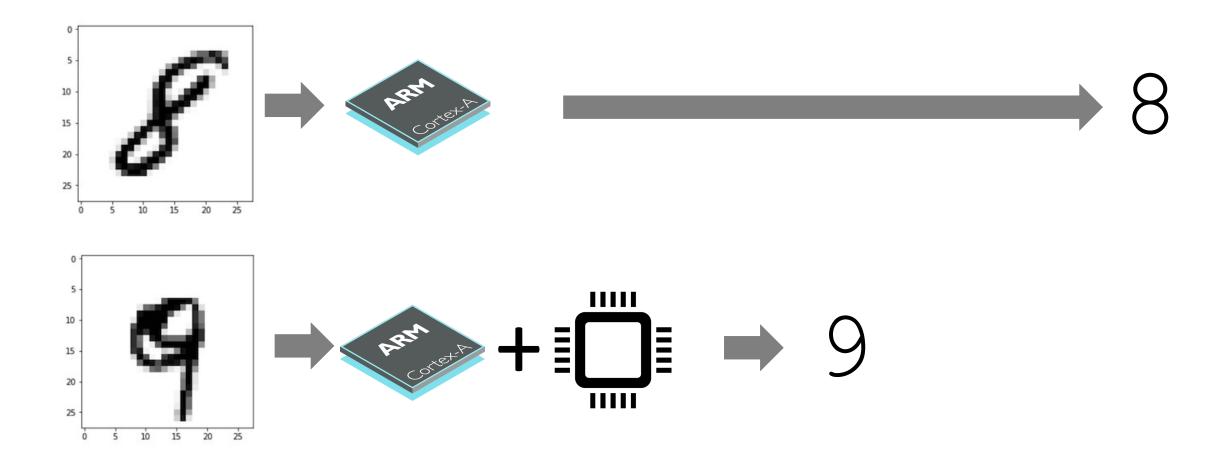
Write that down!

# WARNING: Know Thy Foo()

- Python First few weeks
- C − 2<sup>nd</sup> week onward
- Verilog 3<sup>nd</sup> week onward

If you are not familiar with these, see me after class!

# The goal



This class is <u>NOT</u> about computing.

This class is **NOT** about computing.

It's about computing *FAST*.

# How can we make our computation FAST?

# How can we make our computation FAST?

• Do less work.

• Do work faster.

• Do work in parallel.

# Doing less work?

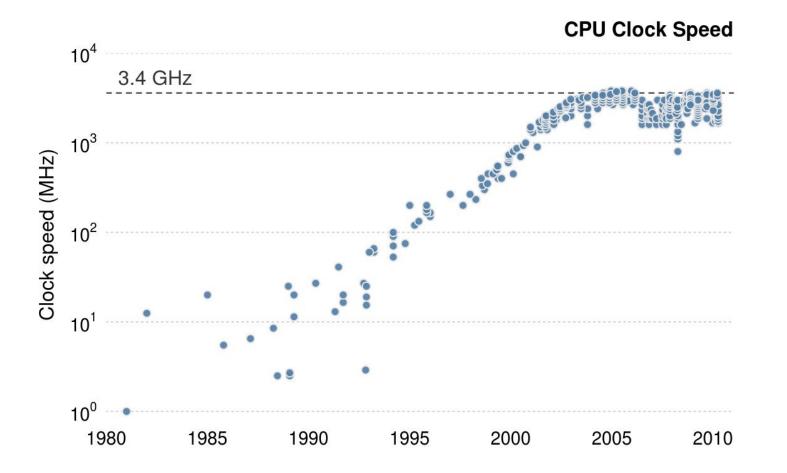
Algorithmic complexity

- Languages:
  - Python vs. C++ vs. C/ASM

- Optimizing compiler
  - gcc -03

Yep. What else?

### Do work faster?

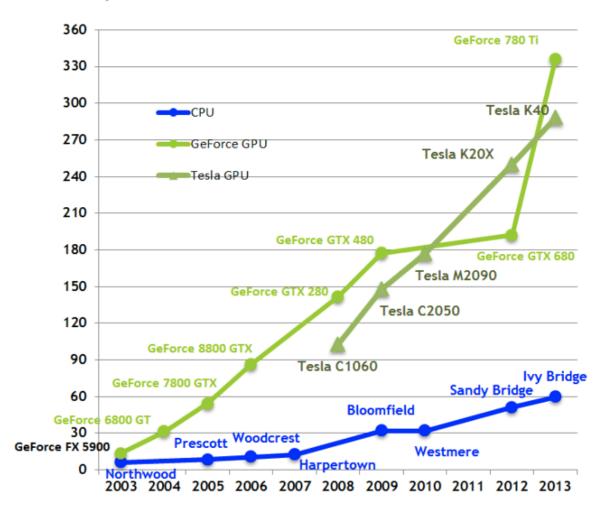




Tried it. Next?

# Do work in parallel?

#### Theoretical GB/s





When it works, it really works!

# How to do work in parallel?

The primary goal of this class is:

Learn methods to accelerate applications

Especially using hardware!

# The secondary goals of this class are:

• Find performance bottlenecks in applications

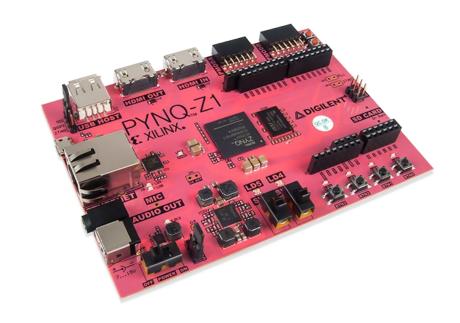
Accelerate applications using parallelization

Learn computer systems architectures!

# We'll be using the Pynq-Z1

- System-on-Chip
  - SoC "S-O-C" or "Sock"
- Contains both FPGA and CPU

- Runs Linux
- http://www.pynq.io/



# E315 assignments are all "optimizations"

• I give you a working software version.

- You need to:
  - a) Make it go faster
  - b) Make it run on hardware
  - c) (usually) both

### About Me

Andrew Lukefahr, Assistant Professor

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Email: <u>lukefahr@Indiana.edu</u>

Office Hours: M/W 3-4pm



Research work on security for FPGA-based systems.

### Email

• I treat email as "e"-mail, not instant massaging

• I bulk respond ~1 time / day. Sometimes ~1 time / 2 days.

# Slack

• Can someone set this up? And add me?

# WARNING: Know Thy Foo()

- Python First few weeks
- $C 2^{nd}$  week onward.
- Verilog 3<sup>nd</sup> week onward.

If you are not familiar with these, see me after class!

### Course Website

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Write that down!

# Performance Profiling

How long does your code take to run?

# Squared Values

```
1  def squares(n):
2    if n <= 1:
3        return [1]
4    else:
5        seq = squares(n-1)
6        seq.append(n*n)
7        return seq</pre>
```

```
for i in range(1,10):
    print (squares(i))

[1]
[1, 4]
[1, 4, 9]
[1, 4, 9, 16]
[1, 4, 9, 16, 25]
[1, 4, 9, 16, 25, 36]
[1, 4, 9, 16, 25, 36, 49]
[1, 4, 9, 16, 25, 36, 49, 64]
[1, 4, 9, 16, 25, 36, 49, 64, 81]
```

### Measuring Execution Time

```
import time

start_time = time.time()

squares(10)
end_time = time.time()

# at the end of the program:
print("%f seconds" % (end_time - start_time))
```

0.000107 seconds

## Measuring Execution Time

```
import time
import sys
sys.setrecursionlimit(21000)

start_time = time.time()
squares(20000)
end_time = time.time()

# at the end of the program:
print("%f seconds" % (end_time - start_time))
```

0.009825 seconds

### How do we *reduce* that time?

```
1  def squares(n):
2    if n <= 1:
3        return [1]
4    else:
5        seq = squares(n-1)
6        seq.append(n*n)
7        return seq</pre>
```

How would we know <u>what</u> to optimize?

# Code Profiling

• In software engineering, profiling ("program profiling", "software profiling") is a form of dynamic program analysis that measures, for example, the space (memory) or time complexity of a program, the usage of particular instructions, or the frequency and duration of function calls. Most commonly, profiling information serves to aid program optimization. [Wiki]

# **Profilers** give us call-stack information about where the program is spending its time.

```
import cProfile
2 cProfile.run('squares(20000)')
       40002 function calls (20003 primitive calls) in 0.021 seconds
 Ordered by: standard name
 ncalls tottime percall
                         cumtime percall filename:lineno(function)
20000/1
          0.019
                   0.000
                            0.021
                                    0.021 <ipython-input-8-50d13c5dd8df>:1(squares)
          0.000 0.000
                          0.021
                                   0.021 <string>:1(<module>)
          0.000 0.000 0.021
                                   0.021 {built-in method builtins.exec}
                                    0.000 {method 'append' of 'list' objects}
  19999
         0.002
                  0.000
                           0.002
                                    0.000 {method 'disable' of 'lsprof.Profiler' objects}
          0.000
                   0.000
                            0.000
```

#### ncalls tottime percall cumtime percall filename: lineno(function)

ncalls: the total number of calls made to a function tottime: the total time taken by all calls to a function percall: time per function call (tottime / ncalls) cumtime: total time spend in this and sub-functions percall: total cumulative time / total time

filename:lineno (function): The name of the python function

### What does this tell us?

```
ncalls tottime percall cumtime percall filename: lineno(function)
20000/1
          0.019
                  0.000
                           0.021
                                   0.021 <ipython-input-8-50d13c5dd8df>:1(squares)
          0.000
                  0.000
                           0.021
                                   0.021 <string>:1(<module>)
          0.000
                                   0.021 {built-in method builtins.exec}
                0.000
                           0.021
          0.002
                  0.000
                           0.002
                                   0.000 {method 'append' of 'list' objects}
 19999
                                   0.000 {method 'disable' of 'lsprof.Profiler' objects}
          0.000
                  0.000
                           0.000
```

### Now, how do we *reduce* that time?

```
1  def squares(n):
2    if n <= 1:
3        return [1]
4    else:
5        seq = squares(n-1)
6        seq.append(n*n)
7        return seq</pre>
```

40002 function calls (20003 primitive calls) in 0.021 seconds

Ordered by: standard name

```
ncalls tottime percall cumtime percall filename: lineno(function)
          0.019
20000/1
                   0.000
                           0.021
                                    0.021 <ipython-input-8-50d13c5dd8df>:1(squares)
          0.000
                                    0.021 <string>:1(<module>)
                   0.000
                           0.021
          0.000
                   0.000
                           0.021
                                    0.021 {built-in method builtins.exec}
 19999
          0.002
                   0.000
                           0.002
                                    0.000 {method 'append' of 'list' objects}
                                    0.000 {method 'disable' of 'lsprof.Profiler' objects}
          0.000
                   0.000
                           0.000
```

### Can we cut the recursion?

```
1  def squares(n):
2    if n <= 1:
3        return [1]
4    else:
5        seq = squares(n-1)
6        seq.append(n*n)
7        return seq</pre>
```

```
1  def squares2(n):
2    if n <= 1:
3        return [1]
4    else:
5        seq = []
6        for i in range(1,n):
7             seq.append(i*i)
8        return seq</pre>
```

```
import time
import sys
sys.setrecursionlimit(21000)

start_time = time.time()
squares(20000)
end_time = time.time()

# at the end of the program:
print("%f seconds" % (end_time - start_time))
```

0.009825 seconds

```
import time

start_time = time.time()

squares2(20000)

end_time = time.time()

# at the end of the program:

print("%f seconds" % (end_time - start_time))
```

0.004209 seconds

0.009825/0.004209 = 2.332.33x Faster!

# Why was it faster?

```
import cProfile
2 cProfile.run('squares2(20000)')
       20003 function calls in 0.007 seconds
 Ordered by: standard name
 ncalls tottime percall
                         cumtime
                                  percall filename:lineno(function)
          0.005
                   0.005
                           0.006
                                    0.006 <ipython-input-21-5c6731cb3b0c>:1(squares2)
          0.000
                 0.000
                         0.007
                                    0.007 <string>:1(<module>)
                                    0.007 {built-in method builtins.exec}
        0.000
                0.000 0.007
                         0.002
                                    0.000 {method 'append' of 'list' objects}
  19999 0.002
                0.000
                                    0.000 {method 'disable' of 'lsprof.Profiler' objects}
          0.000
                0.000
                           0.000
```

### What's missing?

Conclusion #1: Overheads to function calls!

# Can we make it go even faster?

```
1  def squares2(n):
2    if n <= 1:
3        return [1]
4    else:
5        seq = []
6        for i in range(1,n):
7             seq.append(i*i)
8        return seq</pre>
```

```
import time

start_time = time.time()

squares2(20000)

end_time = time.time()

# at the end of the program:
print("%f seconds" % (end_time - start_time))
```

0.004209 seconds

Is there a way to remove list.append()?

# Can we make it go even faster?

```
1  def squares2(n):
2    if n <= 1:
3        return [1]
4    else:
5        seq = []
6        for i in range(1,n):
7             seq.append(i*i)
8    return seq</pre>
```

```
import time

start_time = time.time()

squares2(20000)
end_time = time.time()

# at the end of the program:
print("%f seconds" % (end_time - start_time))
```

0.004209 seconds

```
import numpy as np
def squares3(n):

seq = np.zeros(n, dtype=np.int)
for i in range(1, n+1):
    seq[i-1] = i * i

return seq
```

```
import time

start_time = time.time()

squares3(20000)

end_time = time.time()

# at the end of the program:

print("%f seconds" % (end_time - start_time))
```

0.003960 seconds

```
import cProfile
cProfile.run('squares3(20000)')
```

5 function calls in 0.005 seconds

Ordered by: standard name

```
ncalls tottime
               percall
                        cumtime
                                percall filename:lineno(function)
         0.005
                 0.005
                         0.005
                                  0.005 <ipython-input-68-7272dceb0678>:2(squares3)
         0.000
               0.000
                       0.005
                                  0.005 <string>:1(<module>)
                                  0.005 {built-in method builtins.exec}
         0.000
               0.000 0.005
                                  0.000 {built-in method numpy.zeros}
         0.000
               0.000
                       0.000
         0.000
                0.000
                        0.000
                                  0.000 {method 'disable' of 'lsprof.Profiler' objects}
```

### Next Time

• More on Profiling!

# Introduction

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