#### Lecture 26 — Liar, Liar

Patrick Lam & Jeff Zarnett patrick.lam@uwaterloo.ca jzarnett@uwaterloo.ca

Department of Electrical and Computer Engineering University of Waterloo

January 4, 2019

ECE 459 Winter 2019 1/37



ECE 459 Winter 2019 2/37

## Sampling Based Profiling

Let's open with a video that illustrates one of the problems with sampling-based profiling:

https://www.youtube.com/watch?v=jQDjJRYmeWg

Is this fake?

ECE 459 Winter 2019 3/37

#### Part I

# **Lies about Calling Context**

ECE 459 Winter 2019 4 / 37

### gprof and KCacheGrind

Who can we trust?

Some profiler results are real. Other results are interpolated, and perhaps wrong.

Reference: Yossi Kreinin,

http://www.yosefk.com/blog/how-profilers-lie-the-cases-of-gprof-and-kcachegrind.html

ECE 459 Winter 2019 5/37

#### **Running Example**

```
void work(int n) {
  volatile int i=0; //don't optimize away
  while(i++ < n);
}
void easy() { work(1000); }
void hard() { work(1000*1000*1000); }
int main() { easy(); hard(); }</pre>
```

ECE 459 Winter 2019 6/37

### Running the Running Example

```
[plam@lynch L27]$ gprof ./try gmon.out
Flat profile:
```

```
Each sample counts as 0.01 seconds.
     cumulative
                 self
                                   self
                                           total
                           calls ms/call ms/call
time
       seconds
                seconds
                                                   name
101.30
           1.68
                   1.68
                                  840.78
                                           840.78
                                                   work
 0.00
          1.68
                   0.00
                                    0.00
                                           840.78
                                                   easy
 0.00
          1.68
                   0.00
                                    0.00
                                           840.78
                                                   hard
```

That's not right! easy takes  $\approx$  0s, hard takes 1.68s.

ECE 459 Winter 2019 7/37

### What's Wrong?

Need to understand how gprof works.

■ **profil()**: asks glibc to record which instruction is currently executing (100×/second).

mcount(): records call graph edges; called by -pg instrumentation.

**profil** information is statistical; **mcount** information is exact.

ECE 459 Winter 2019 8 / 37

#### **Those Numbers Again**

```
Flat profile:
Each sample counts as 0.01 seconds.
     cumulative
                  self
                                    self
                                            total
       seconds
                            calls ms/call
                                           ms/call
time
                 seconds
                                                    name
101.30
           1.68
                    1.68
                                   840.78 840.78
                                                    work
 0.00
           1.68
                    0.00
                                      0.00 *840.78* easy
```

calls: reliable;

1.68

0.00

■ self seconds: sampled, but OK here;

0.00

■ total ms/call: interpolated!

[plam@lynch L27]\$ gprof ./try gmon.out

ECE 459 Winter 2019 9 / 37

0.00 \*840.78\* hard

#### gprof sees:

- total of 1.68s in work,
- 1 call to work from easy;
- 1 call to work from hard.

All of these numbers are reliable.

gprof's unreliable conclusion: easy, hard both cause 840ms of work time.

Wrong: work takes 1000000× longer when called from hard!

ECE 459 Winter 2019 10 / 37

## Where gprof guesses: Call graph edges

- contribution of children to parents;
- total runtime spent in self+children;

etc.

ECE 459 Winter 2019 11/37

#### When are call graph edges right?

#### Two cases:

- functions with only one caller (e.g. f() only called by g()); or,
- functions which always take the same time to complete (e.g. rand()).

#### What's sketchy:

Any function whose running time depends on its inputs, and which is called from multiple contexts.

ECE 459 Winter 2019 12/3

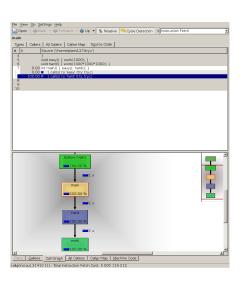
#### **KCacheGrind**

KCacheGrind is a frontend to callgrind.

callgrind is part of valgrind, and runs the program under an x86 JIT.

ECE 459 Winter 2019 13 / 37

#### KCacheGrind example



Yes, hard takes all the time.

ECE 459 Winter 2019 14 / 37

#### More Complex Example

```
void worker1(int n) {
  volatile int i=0;
  while (i++<n);
void worker2(int n) {
  volatile int i=0;
  while (i++< n):
void manager(int n1, int n2) {
  worker1(n1);
  worker2(n2);
void project1() {
  manager(1000, 1000000);
void project2() {
  manager(1000000, 1000);
int main() {
  project1();
  project2();
```

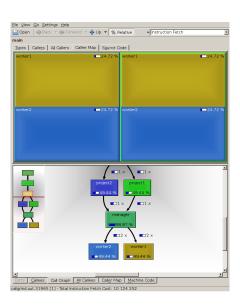
ECE 459 Winter 2019 15 / 37

### Example explained in 2 lines

Now worker2 takes all the time in project1, and worker1 takes all the time in project2.

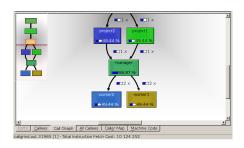
ECE 459 Winter 2019 16/37

#### What about KCacheGrind now?



ECE 459 Winter 2019 17/37

#### **KCacheGrind Truths**

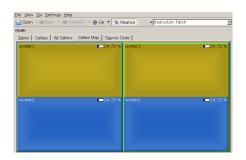


This is the call graph. worker1 and worker2 do each take about 50% of time. So do project2 and project1.

(gprof would interpolate that too.)

ECE 459 Winter 2019 18/37

#### **KCacheGrind Lies**



#### KCacheGrind is reporting:

worker1 and worker2 doing half the work in each project.

That's not what the code says.

ECE 459 Winter 2019 19 / 37

### Why KCacheGrind Lies

- gprof reports time spent in f() and g(), and how many times f() calls g().
- callgrind also reports
   time spent in g() when called from f(),
   i.e. some calling-context information.
- callgrind does not report time spent in g() when called from f() when called from h().

We don't get the project1 to manager to worker1 link.

■ (We have Edges but need Edge-Pairs).

ECE 459 Winter 2019 20 / 37

## gprof/KCacheGrind summary

Some results are exact; some results are sampled; some results are interpolated.

If you understand the tool, you understand where it can go wrong.

Understand your tools!

ECE 459 Winter 2019 21/37

### Part II

## **Lies from Metrics**

ECE 459 Winter 2019 22/37

### Lying perf counters

While app-specific metrics can lie too, mostly we'll talk about CPU perf counters.

Reference: Paul Khuong,

http://www.pvk.ca/Blog/2014/10/19/performance-optimisation-~-writing-an-essay/

ECE 459 Winter 2019 23/37

#### mfence

We've talked about mfence. Used in spinlocks, for instance.

Profiles said: spinlocking didn't take much time. Empirically: eliminating spinlocks = better than expected!

ECE 459 Winter 2019 24/37

### Exploring the lie

Next step: create microbenchmarks.

Memory accesses to uncached locations, or computations,

surrounded by store pairs/mfence/locks.

Use perf to evaluate impact of mfence vs lock.

ECE 459 Winter 2019 25/37

```
$ perf annotate —s cache misses
[...]
    0.06 :
                  4006b0:
                                 and
                                        %rdx.%r10
    0.00:
                  4006b3:
                                 add
                                         $0x1,%r9
    :: random (out of last level cache) read
    0.00 :
                  4006b7:
                                 mov
                                        (%rsi,%r10,8),%rbp
   30.37 :
                  4006bb:
                                        %rcx.%r10
                                 mov
    :: foo is cached, to simulate our internal lock
    0.12 :
                                        %r9,0x200fbb(%rip)
                  4006be:
                                 mov
    0.00:
                  4006c5:
                                 shl
                                         $0x17,%r10
    [... Skipping arithmetic with < 1% weight in the profile]
    ;; locked increment of an in-cache "lock" byte
    1.00:
                  4006e7:
                                 lock incb 0x200d92(%rip)
   21.57 .
                  4006ee:
                                 add
                                         $0x1.%rax
    [...]
    ;; random out of cache read
   0.00 .
                  400704
                                 xor
                                        (%rsi,%r10,8),%rbp
   21.99 :
                                        %r9,%r8
                  400708:
                                 xor
    ;; locked in-cache decrement
    0.00:
                  400729:
                                 lock decb 0x200d50(%rip)
   18.61 :
                  400730:
                                 add
                                         $0x1.%rax
    [...]
    0.92 :
                  400755:
                                         4006b0 <cache misses+0x30>
                                 jne
```

ECE 459 Winter 2019 26 / 37

#### lock's effects

Reads take 30 + 22 = 52% of runtime Locks take 19 + 21 = 40%.

ECE 459 Winter 2019 27 / 37

#### perf for mfence

```
$ perf annotate -s cache misses
[...]
    0.00 :
                   4006b0:
                                   and
                                          %rdx,%r10
    0.00 :
                   4006b3:
                                   add
                                          $0x1,%r9
    ;; random read
    0.00 :
                   4006b7:
                                   mov
                                          (%rsi,%r10,8),%rbp
   42.04 :
                   4006bb:
                                   mov
                                          %rcx,%r10
    ;; store to cached memory (lock word)
    0.00:
                   4006he:
                                          %r9,0x200fbb(%rip)
                                   mov
    [...]
    0.20 :
                                   mfence
                   4006e7:
    5.26 :
                   4006ea:
                                   add
                                          $0x1.%rax
    [...]
    ;; random read
    0.19 .
                   400700:
                                          (%rsi,%r10,8),%rbp
                                   xor
   43.13 :
                                          %r9,%r8
                   400704:
                                   xor
    [...]
    0.00:
                   400725:
                                   mfence
    4.96 :
                   400728:
                                   add
                                           $0x1,%rax
    0.92 :
                   40072c:
                                   add
                                           $0x1.%rax
    [...]
    0.36:
                   40074d:
                                   ine
                                          4006b0 <cache_misses+0x30>
```

ECE 459 Winter 2019 28 / 37

#### mfence's effects

Looks like the reads take 85% of runtime, while the mfence takes 15% of runtime.

ECE 459 Winter 2019 29 / 37

### Bigger picture

Must also look at total # of cycles.

No atomic/fence: 2.81e9 cycles lock inc/dec: 3.66e9 cycles mfence: 19.60e9 cycles

That 15% number is a total lie.

ECE 459 Winter 2019 30 / 37

#### **Conclusions**

- mfence underestimated;
- lock overestimated.

#### Why?

mfence = pipeline flush, costs attributed to instructions being flushed.

ECE 459 Winter 2019 31/37

#### The Long Tail

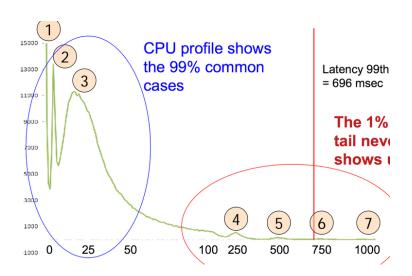
Suppose we have a task that's going to get distributed over multiple computers (like a search).

If we look at the latency distribution, the problem is mostly that we see a long tail of events.

When we are doing a computation or search where we need all the results, we can only go as the slowest step.

ECE 459 Winter 2019 32 / 37

### Grab the Tiger by the Tail



ECE 459 Winter 2019 33 / 37

### **Explaining the Peaks**

- Found in RAM
- 2 Disk Cache
- 3 Disk
- and above... very strange!

ECE 459 Winter 2019 34 / 37

### Why 250, 500, 750, 1000?

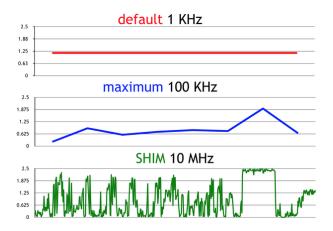
Answer: CPU throttling!

This was happening on 25% of disk servers at Google, for an average of half an hour a day!

ECE 459 Winter 2019 35/37

### Faster than a Speeding Bullet

Another problem with sampling, this time from Lucene:



Why is perf limited to 100 KHz?

#### **Processing Interrupts**

Answer: perf samples are done with interrupts (slow).

If you crank up the rate of interrupts, before long, you are spending all your time handling the interrupts rather than doing useful work.

SHIM gets around this by being more invasive.

This produces a bunch of data which can be dealt with later.

ECE 459 Winter 2019 37/37