Retrofitting Parallelism onto OCaml

"KC" Sivaramakrishnan







• Adds native support for concurrency and parallelism to OCaml

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Effect Handlers

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Effect Handlers

Domains

OCaml 5.0

- Domains and the runtime system support for effect handlers will land in OCaml 5.0
 - Expected to be released alongside 4.14 (Q2 2022)
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opam install 4.12.0+domains+effects

Outline of the talk

- I. Challenges of adding parallelism to OCaml
- 2. Deep dive into the new parallel GC for OCaml
- 3. High-level parallel programming with **Domainslib**

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Backwards compatibility before scalability

- Feature backwards compatibility
 - Do not break existing code



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 - Existing programs run just as fast using just the same memory
- GC Latency before multicore scalability
- Compatibility with program inspection tools
- Performant concurrent and parallel programming abstractions



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 - Dolan et al, "Bounding Data Races in Space and Time", PLDI'18
- No restrictions on sharing objects between domains
 - But how does it work?













• A generational, non-moving, incremental, mark-and-sweep GC



• Fast allocations



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- Max GC latency < 10 ms, 99th percentile latency < 1 ms

Multicore OCaml: Minor GC



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Multicore OCaml: Minor GC



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 - Fast allocations without synchronisation
- Pointers permitted between minor arenas and major heap


- Stop-the-world parallel minor collection when a domain runs out of minor heap
 - 2 global barriers / minor gc



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 - ◆ 2 global barriers / minor gc
- Bringing domains to a stop surprisingly fast
 - Poll points inserted into non-allocating loops
- On 24 cores, ~10 ms pauses for completing stop-the-world minor GC

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 - Malloc for large allocations
- Most allocations do not need synchronisation
- Sequential performance on par with OCaml's recent best-fit allocator

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Marking is racy but uses plain non-atomic stores and idempotent



• Marking & sweeping done \Rightarrow stop-the-world



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• Stop-the-world pauses are ~5 ms on 24 cores

Sequential Performance: Normalised time



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- ~I% faster than stock (geomean of normalised running times)
 - Difference under measurement noise mostly
 - Outliers due to difference in allocators

Sequential Performance: Max pause time



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Pausetimes are lower under Multicore OCaml than stock OCaml

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Let's look at examples!

Recursive Fibonacci - Sequential

let rec fib n =
 if n < 2 then 1
 else fib (n-1) + fib (n-2)</pre>

Recursive Fibonacci - Parallel

module T = Domainslib.Task

```
let fib n =
   let pool = T.setup_pool
    ~num_additional_domains:(num_domains - 1) in
   let res = fib_par pool n in
   T.teardown_pool pool;
   res
```

Recursive Fibonacci - Parallel

```
module T = Domainslib.Task
```

```
let rec fib_par pool n =
  if n <= 40 then fib_seq n</pre>
  else
    let a = T.async pool (fun _ -> fib_par pool (n-1)) in
    let b = T.async pool (fun _ -> fib_par pool (n-2)) in
    T.await pool a + T.await pool b
let fib n =
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Performance: fib(48)

Cores	Time (Seconds)	Vs Serial	Vs Self
1	37.787	0.98	1
2	19.034	1.94	1.99
4	9.723	3.8	3.89
8	5.023	7.36	7.52
16	2.914	12.68	12.97
24	2.201	16.79	17.17





```
let next () =
    for x = 0 to board_size - 1 do
    for y = 0 to board_size - 1 do
        next_board.(x).(y) <- next_cell cur_board x y
        done
    done;</pre>
```

. . .

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let next () =
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  done;
  . . .
let next () =
  T.parallel_for pool ~start:0 ~finish:(board_size - 1)
    \simbody:(fun x ->
       for y = 0 to board_size - 1 do
         next_board.(x).(y) <- next_cell cur_board x y</pre>
       done);
```

Performance: Game of Life

Board size = 1024, Iterations = 512

Cores	Time (Seconds)	Vs Serial	Vs Self
1	24.326	1	1
2	12.290	1.980	1.98
4	6.260	3.890	3.89
8	3.238	7.51	7.51
16	1.726	14.09	14.09
24	1.212	20.07	20.07

Performance Hacking: N-body

- Simulates the orbits of large number of astronomical objects
- Taken from computer language benchmarks game



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Sequential N-body

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    for i = 0 to Array.length bodies - 1 do
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       let b = bodies.(i) in
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       for j = 0 to Array.length bodies - 1 do
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22
         let b' = bodies.(j) in
         if (i!=j) then begin
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           let dx = b.x - b'.x and dy = b.y - b'.y and dz = b.z - b'.z in
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          let dist2 = dx *. dx +. dy *. dy +. dz *. dz in
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          let mag = dt /. (dist2 *. sqrt(dist2)) in
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           b.vx <- b.vx -. dx *. b'.mass *. mag;
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           b.vz <- b.vz -. dz *. b'.mass *. mag;
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Samples:	17K of even	t 'cycles:uppp',	Event count (approx.): 12363186877
Overhead	Command	Shared Object	Symbol
99.87%	nbody.exe	nbody.exe	<pre>[.] camlDuneexeNbodyadvance_230</pre>
0.12%	nbody.exe	nbody.exe	<pre>[.] camlDuneexeNbodyenergy_246</pre>
0.00%	nbody.exe	nbody.exe	<pre>[.] camlStdlibdomainget_355</pre>
0.00%	nbody.exe	[kernel]	[k] 0xfffffffb44009e7

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• $\sim 5X$ speedup on 8 cores compared to sequential version.

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- Can we do better?

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- $\sim 5X$ speedup on 8 cores compared to sequential version.
- Can we do better?
- All the domains writing to the same shared array bodies in the inner loop
 - Leads to poor cache behaviour

Parallel N-Body (cache friendly)

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        for j = 0 to Array.length bodies - 1 do
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            let dist2 = dx *. dx +. dy *. dy +. dz *. dz in
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            let mag = dt /. (dist2 *. sqrt(dist2)) in
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            vx := !vx - . dx * . b'.mass * . mag;
35
            vy := !vy -. dy *. b'.mass *. mag;
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            vz := !vz -. dz *. b'.mass *. mag;
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           end
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         b.vx <- |vx|
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         b.vy < - !vy;
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• 22% faster than the unoptimised version

Parallel N-Body (cache friendly)

kc@kaveri:~/temp/nbody\$ perf stat -e cycles,cycle_activity.cycles_no_execute,cycle_activity.stalls_mem_any, mem_load_uops_l3_miss_retired.remote_hitm ./_build/default/nbody_multicore.exe 8 10745700105645904.0000000000 10745765317367518.0000000000

Performance counter stats for './_build/default/nbody_multicore.exe 8':

16,919,777,849	cycles
4,099,415,910	cycle_activity.cycles_no_execute
3,864,941,761	cycle_activity.stalls_mem_any
1,374,487	mem_load_uops_13_miss_retired.remote_hitm

0.861178677 seconds time elapsed

```
kc@kaveri:~/temp/nbody$ perf stat -e cycles,cycle_activity.cycles_no_execute,cycle_activity.stalls_mem_any,
mem_load_uops_l3_miss_retired.remote_hitm ./_build/default/nbody_multicore_optimised.exe 8
10745700105645904.000000000
10745765317367518.000000000
```

Performance counter stats for './_build/default/nbody_multicore_optimised.exe 8':

13,993,448,825	cycles
2,926,815,349	cycle_activity.cycles_no_execute
2,844,213,127	cycle_activity.stalls_mem_any
409,388	mem_load_uops_13_miss_retired.remote_hitm

0.701971803 seconds time elapsed

https://www.brendangregg.com/linuxperf.html

Parallel Scalability



On 4 x 32-core AMD EPYC 7551

Parallel Latency



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- Sivaramakrishnan et al, "<u>Retrofitting Parallelism onto OCaml</u>", ICFP 2020