

#### Parallel Dot Product

https://github.com/VeriNum/pardotprod

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#### **Abstract**

We demonstrate how to use the Verified Software Toolchain to prove correctness of a parallel program that uses barrier synchronization implemented with binary semaphores.



That is: master thread breaks the job into T separate tasks, hands off T-1 tasks to other threads (that are already waiting for them) by releasing per-thread semaphores. Then the master works on one task, then waits on T-1 semaphores for all the other threads to finish their task.

As an example, we demonstrate parallel dot product. But the work-splitting API is quite general. It would easily apply to more useful parallel "clients" such as blocked matrix multiply or other algorithms that can use barrier synchronization.

#### Part 1: The client program and API

In part 1 we don't use formal methods at all. We just present the C program that we intend to prove correct. The program is divided into

- a parallelism API (for handling work that's split into T tasks) and
- an application "client" program that uses the API (in this case, parallel dot-product).

## Simple Task Parallelism

 Have a function to compute on big data  $\sum_{i=1}^{n} x_i \cdot y_i$ 

- Have T processors
- Divide computation into T subfunctions (compute in parallel)

$$\delta_t \stackrel{\text{def}}{=} \left[ \frac{nt}{T} \right] \qquad \sum_{i=\delta_t}^{\delta_{t+1}} x_i \cdot y_i$$

 Combine subresults together

$$\sum_{t=0}^{T} \sum_{i=\delta_t}^{\delta_{t+1}} x_i \cdot y_i$$

All ranges are [lo,hi)

## API for work-splitting

What's in a **struct task** is the private information of the task-scheduling system (parsplit.c) but you can imagine it contains a couple of semaphores, among other things.

The client decides what operation is to be performed in a task, and passes that into initialize\_task as the function-parameter faccompanied by supplementary client-side information called closure. The client will call initialize\_task T times, with t ranging from 0 to T-1, presumably with different closure values for each one.

#### Scenario

Suppose you have T processors, and your program is going to compute many dot products on vectors of length n.

First, use make\_tasks to create *T* threads, and then use initialize task to tell each thread what work it's going to have to do.

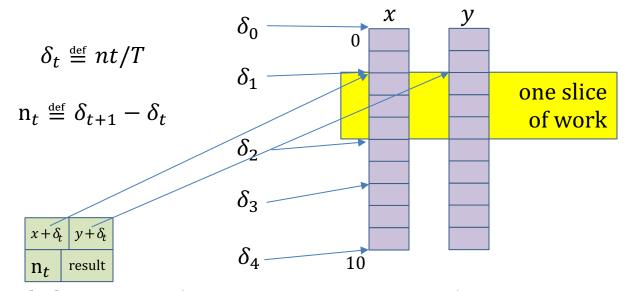
```
void make_dotprod_tasks(unsigned T) {
  unsigned t;
  tasks = make_tasks(T);
  ... /* more to come */ ...

for (t=0; t<T; t++)
    initialize_task(tasks, t, ... /* more to come */ ...);
}</pre>
```

Later, when the program wants to compute a dot-product, it will update the per-task data (i.e., the vectors to be multiplied) and call do tasks to start all *T* threads working.

#### Example: n=10, T=4

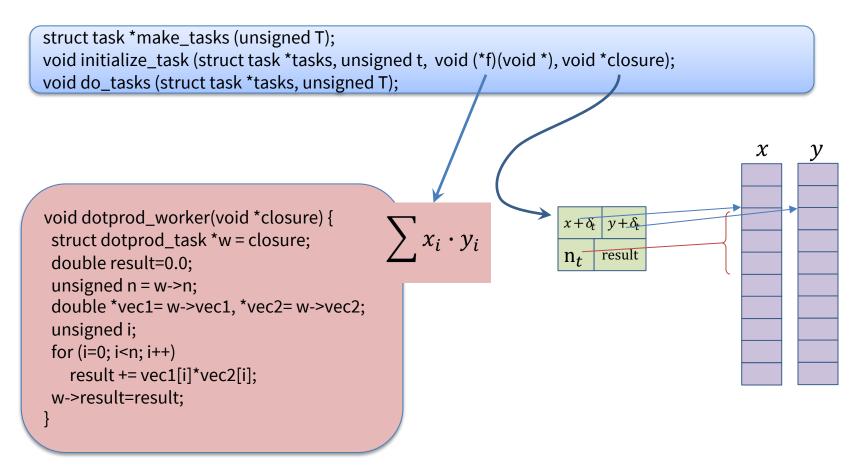
```
struct task *make_tasks (unsigned T);
void initialize_task (struct task *tasks, unsigned t, void (*f)(void *), void *closure);
void do_tasks (struct task *tasks, unsigned T);
```



Task description (struct dotprod\_task)

For the dot-product client, a closure (i.e., task-description) has pointers to vector-slice  $x + \delta_t$ , vector-slice  $y + \delta_t$ , length of the vector slices  $n_t$ , and a space into which the slice result can be written. If the original vector length is not exactly a multiple of the number of threads, then some slices will be a bit longer than others.

## Application-specific subtask function



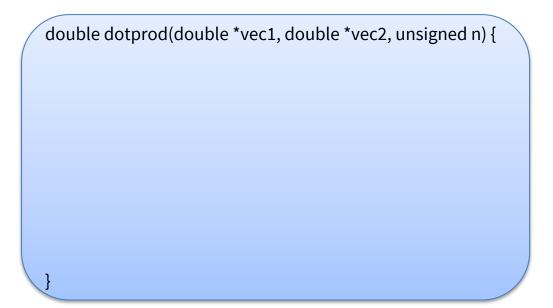
The dotprod\_worker is given a pointer to a closure and computes the slice dot product for that task-description. The formal parameter has type void\* instead of struct dotprod\_task \* because the task-scheduler (parsplit.c, parsplit.h) must be general enough that it doesn't even know the type of the task-description.

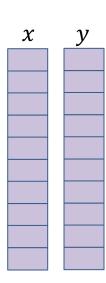
Hence the assignment from closure to w in the first line of the function body.

#### How the client uses the API

```
struct task *make_tasks (unsigned T);
void initialize_task (struct task *tasks, unsigned t, void (*f)(void *), void *closure);
void do_tasks (struct task *tasks, unsigned T);
```

Suppose you want to compute the dot-product of vectors x and y, in parallel. Each vector has length n.





## Creating the task-descriptions

```
struct task *make_tasks (unsigned T);
void initialize_task (struct task *tasks, unsigned t, void (*f)(void *), void *closure);
void do_tasks (struct task *tasks, unsigned T);
```

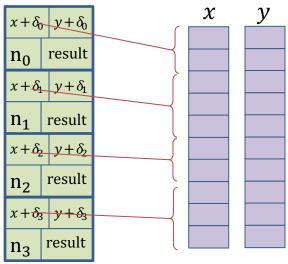
First, compute how you're going to break it into T tasks. If n is not an exact multiple of T, then the sizes  $n_0, n_1, n_2, ...$  won't be exactly the same.

$$\delta_t \stackrel{\text{\tiny def}}{=} nt/T$$

$$\mathbf{n}_t \stackrel{\text{def}}{=} \delta_{t+1} - \delta_t$$

```
double dotprod(double *vec1, double *vec2, unsigned n) {
  for (delta=0, t=0; t<T; t++) {
    dtasks[t].vec1=vec1+delta;
    dtasks[t].vec2=vec2+delta;
    delta_next = (t+1)*n/T;
    dtasks[t].n= delta_next-delta;
    delta=delta_next;
  }
  ...
}</pre>
```

#### dtasks

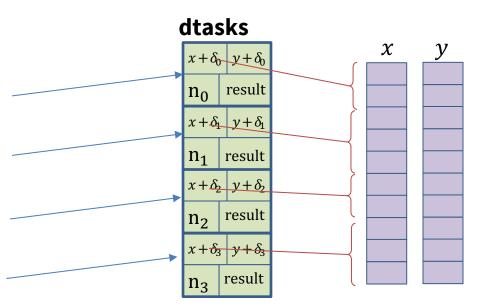


(For how & when the dtasks array was created, wait a couple of slides. Here we're just filling it in.)

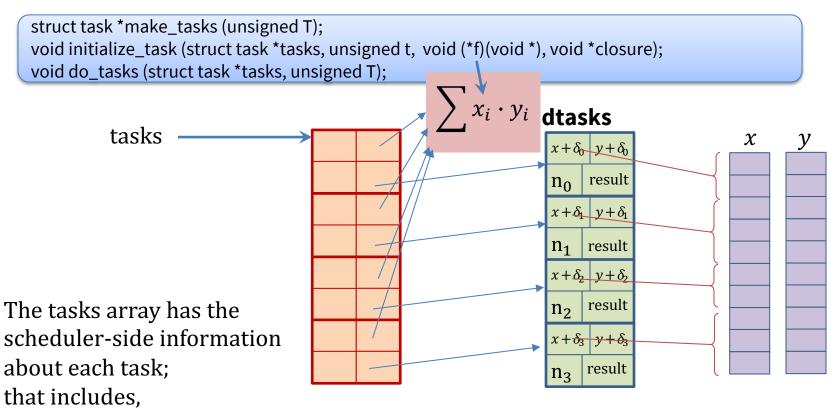
#### dotprod\_worker

```
struct task *make_tasks (unsigned T);
void initialize_task (struct task *tasks, unsigned t, void (*f)(void *), void *closure);
void do_tasks (struct task *tasks, unsigned T);
```

Each of these pointers is a "closure" that can be passed to the dotprod\_worker function. The next step is to register each of these n=4 closures with the task manager

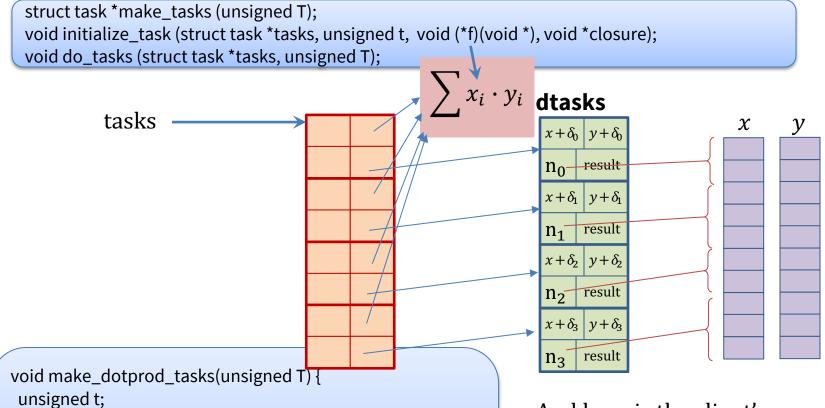


## do\_tasks()



as shown here, pointer to what function f to execute and the specific closure information for each task.

## make\_tasks(), initialize\_task()



tasks = make tasks(T);

dtasks=(struct dotprod\_task \*)malloc(T\*sizeof(...));

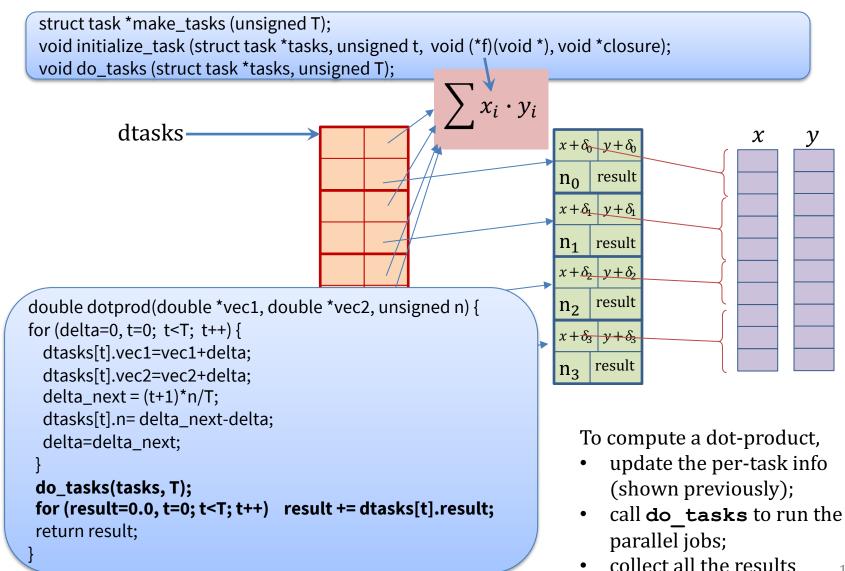
initialize task(tasks, t, dotprod worker, dtasks+t);

num\_threads=T:

for (t=0; t<T; t++)

And here is the client's function that creates both the tasks array and the dtasks array, and fills in the tasks.

## do\_tasks()



#### That's the entire dotprod.c client

```
double dotprod(double *vec1, double *vec2, unsigned n) {
void dotprod_worker(void *closure) {
                                                                for (delta=0, t=0; t<T; t++) {
struct dotprod task *w = closure.
                                                                             ec1=vec1+delta;
                void make dotprod tasks(unsigned T) {
double result/
                                                                              c2=vec2+delta;
                 unsigned t;
unsigned n =
                                                                              (t+1)*n/T;
                 tasks = make_tasks(T);
double *vec1
                                                                              delta next-delta;
                 num_threads=T:
>vec2:
                                                                              next;
                 dtasks=(struct dotprod task *)malloc(T*sizeof(...));
unsigned i;
                 for (t=0; t<T; t++)
for (i=0; i<n; i
                                                                              ks, T);
                     initialize_task(tasks, t, dotprod_worker, dtasks+t);
   result += ve
                                                                             .0, t=0; t<T; t++) result += dtasks[t].result;
w->result=result
                                                                 return result;
```

```
struct task *make_tasks (unsigned T);
void initialize_task (struct task *tasks, unsigned t, void (*f)(void *), void *closure);
void do_tasks (struct task *tasks, unsigned T);
```

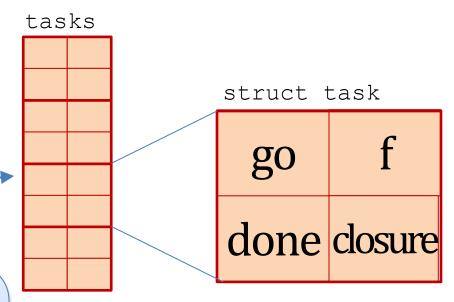
#### Part 2: How the parallelism is implemented

```
struct task *make_tasks (unsigned T);
void initialize_task (struct task *tasks, unsigned t, void (*f)(void *), void *closure);
void do_tasks (struct task *tasks, unsigned T);
```

This is the API; how do these functions work?

## thread\_worker(), make\_tasks()

# struct task \*make\_tasks (unsigned T); void initialize\_task (struct task \*tasks, unsigned t, void (\*f)(void \*), void \*closure); void do\_tasks (struct task \*tasks, unsigned T);



int thread\_worker(void \*arg) {
 struct task \*t = (struct task \*)arg;
 while (1) {
 acquire(t->go);
 t->f(t->closure);
 release(t->done);
 }
}

What runs in each thread is simple:

- wait for the go signal,
- run the function f on the closure,
- send the done signal.

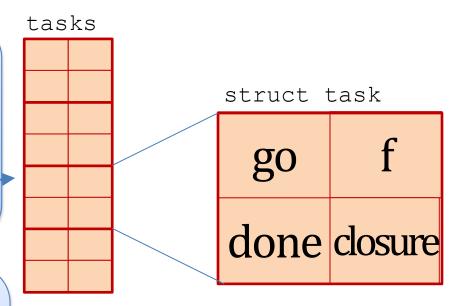
Repeat forever.

## thread\_worker(), make\_tasks()

```
struct task *make_tasks (unsigned T);
void initialize_task (struct task *tasks, unsigned t, void (*f)(void *), void *closure);
void do_tasks (struct task *tasks, unsigned T);
```

```
struct task *make_tasks(unsigned T) {
  tasks = malloc(T * sizeof (...));
  for (i=1; i<T; i++) {
    struct task *t = tasks+i;
    t->go = makelock();
    t->done = makelock();
    spawn(thread_worker, t);
  }
  return tasks;
}
```

```
int thread_worker(void *arg) {
  struct task *t = (struct task *)arg;
  while (1) {
    acquire(t->go);
    t->f(t->closure);
    release(t->done);
  }
}
```



All make\_tasks does is,

- create all the go and done semaphores
- spawn all the threads to run thread\_worker

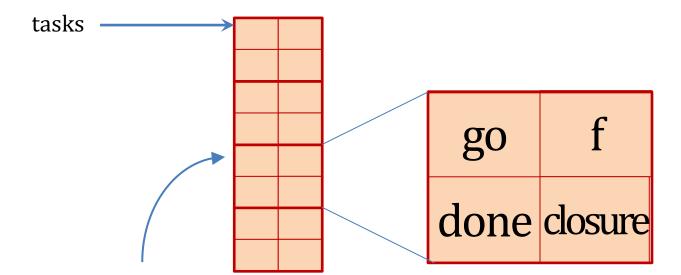
(semaphores are created in the *locked* state, so the first thing all those threads do is block on the acquire).

#### initialize\_task()

```
struct task *make_tasks (unsigned T);

void initialize_task (struct task *tasks, unsigned t, void (*f)(void *), void *closure);

void do_tasks (struct task *tasks, unsigned T);
```

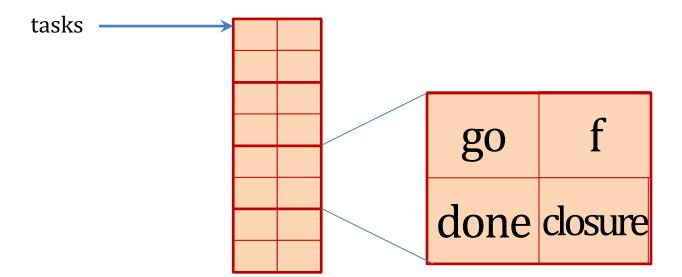


After the client calls make\_tasks to spawn all the threads, then the client calls initialize\_task to fill in the info about the function and closure.

#### do\_tasks()

```
struct task *make_tasks (unsigned T);
void initialize_task (struct task *tasks, unsigned t, void (*f)(void *), void *closure);

void do_tasks (struct task *tasks, unsigned T);
```



```
void do_tasks(struct task *tasks, unsigned T) {
for (i=1; i<T; i++)
    release (tasks[i].go);
   tasks[0].f(tasks[0].closure);
   for (i=1; i<T; i++)
    acquire (tasks[i].done);
}</pre>
```

To compute a parallel dot product, the client calls **do\_tasks** which is very simple: send each thread the **go** signal, compute task 0 locally, wait for each thread to send the **done** signal.

## That's the entire parsplit.c

```
struct task *make_tasks (unsigned T);
void initialize_task (struct task *tasks, unsigned t, void (*f)(void *), void *closure);
void do_tasks (struct task *tasks, unsigned T);
```

```
struct task *make_tasks(unsigned
tasks = malloc(T * sizeof (...));
for (i=1; i<T; i++) {
    struct task *t = tasks+i;
    t->go = makelock();
    t->done = makelock();
    spawn(thread_worker, t);
}
return tasks;
}
```

```
int thread_worker(void *arg) {
  struct task *t = (struct task *)arg;
  while (1) {
    acquire(t->go);
    t->f(t->closure);
    release(t->done);
  }
}
```

```
void initialize_task (struct task *tasks,
    unsigned i, void (*f)(void *), void *closure) {
    tasks[i].f=f;
    tasks[i].closure=closure;
}
```

```
void do_tasks(struct task *tasks, unsigned T) {
for (i=1; i<T; i++)
    release (tasks[i].go);
    tasks[0].f(tasks[0].closure);
    for (i=1; i<T; i++)
        acquire (tasks[i].done);
}</pre>
```

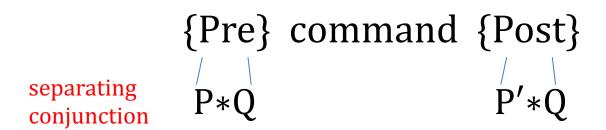
Part 3

#### **HOW TO PROVE IT**

#### Separation Logic

If state satisfies the precondition

then it's safe to run the command and the state after will satisfy the postcondition

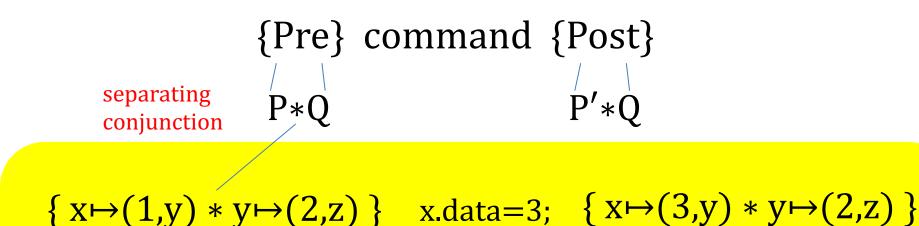


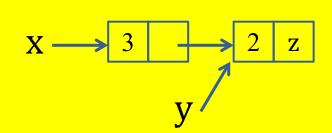
#### Separation Logic

If state satisfies the precondition

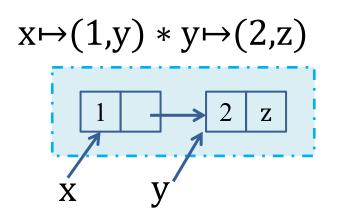
then it's safe to run the command

and the state after will satisfy the postcondition

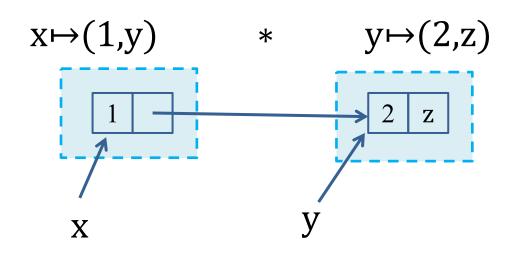




## Heaplets in Separation Logic

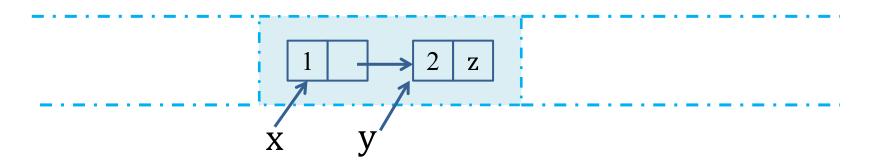


A "heaplet" is a model of a separating conjunct; it's a (not necessarily contiguous) part of memory with a given footprint (domain)

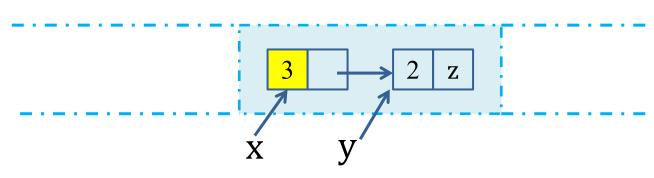


The separating conjunction \* is about the union of two disjoint footprints

## Heaplets in Separation Logic



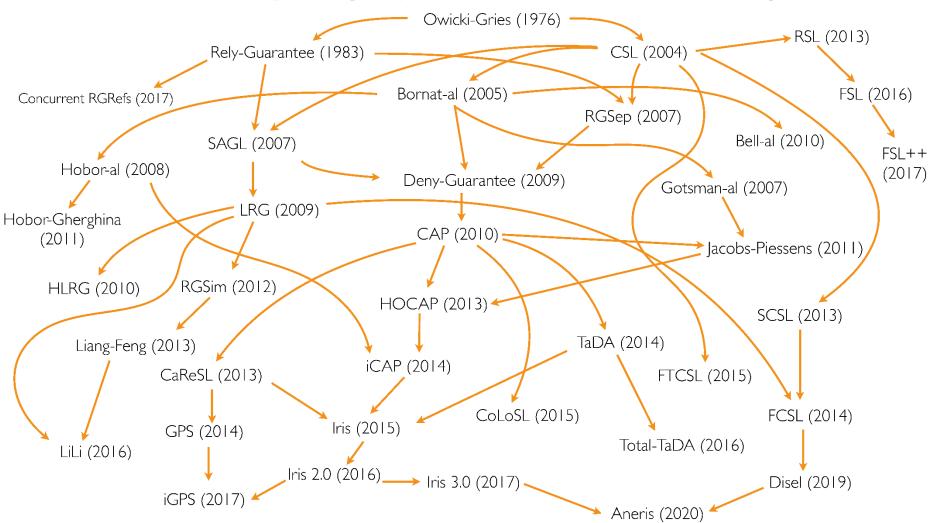
$$\{x\mapsto (1,y) * y\mapsto (2,z)\}$$
 x.data=3;  $\{x\mapsto (3,y) * y\mapsto (2,z)\}$ 



We can safely say that x.data is updated and y.data is still 2, because x cannot be aliased with y if the precondition is satisfied

## **Concurrent Separation Logics**

CSL uses separating conjunction to do thread-local reasoning



But there are many flavors of CSL since O'Hearn's 2004 original

diagram: Ilya Sergey

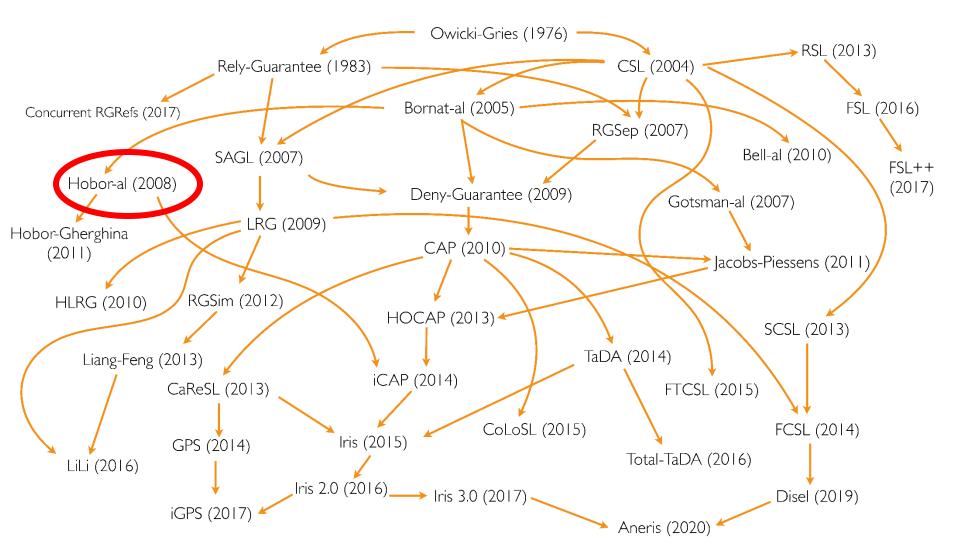
#### How to prove it

Some of those CSLs are quite complicated (but very expressive). But our needs here are simple:

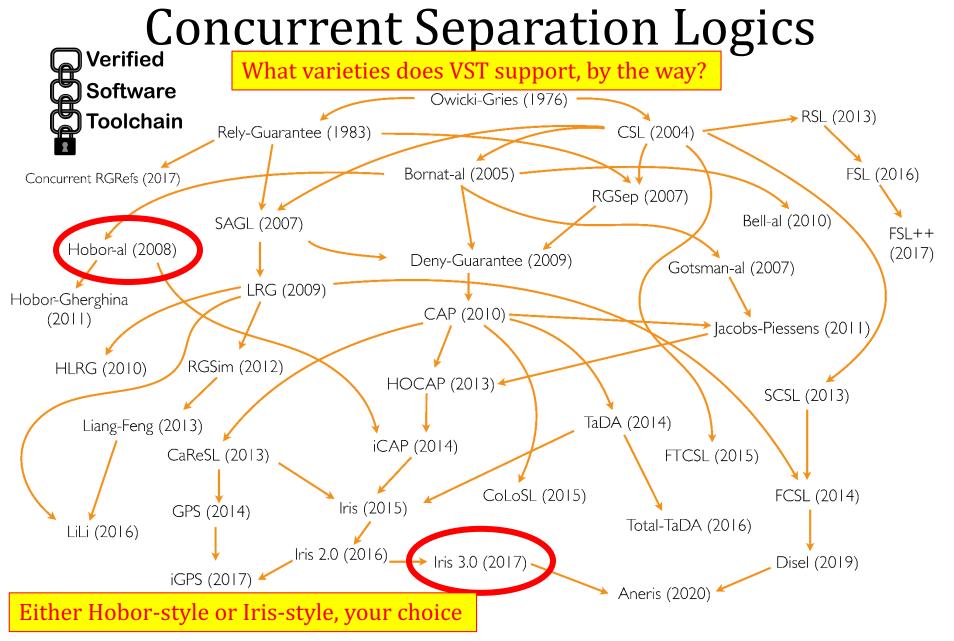
- Don't need ghost state
- Don't need partial commutative monoid
- Semaphores with "old-fashioned" lock invariants
- Permission-splitting

∴ all the theory was in place by 2008!

#### **Concurrent Separation Logics**



Oracle Semantics for Concurrent Separation Logic, by Aquinas Hobor, Andrew W. Appel, and Francesco Zappa Nardelli. *European Symposium on Programming (ESOP)*, 2008.



#### Resource invariants

- O'Hearn 2004
- Gotsman *et al.* 2007
- Hobor, Zappa Nardelli, Appel 2008

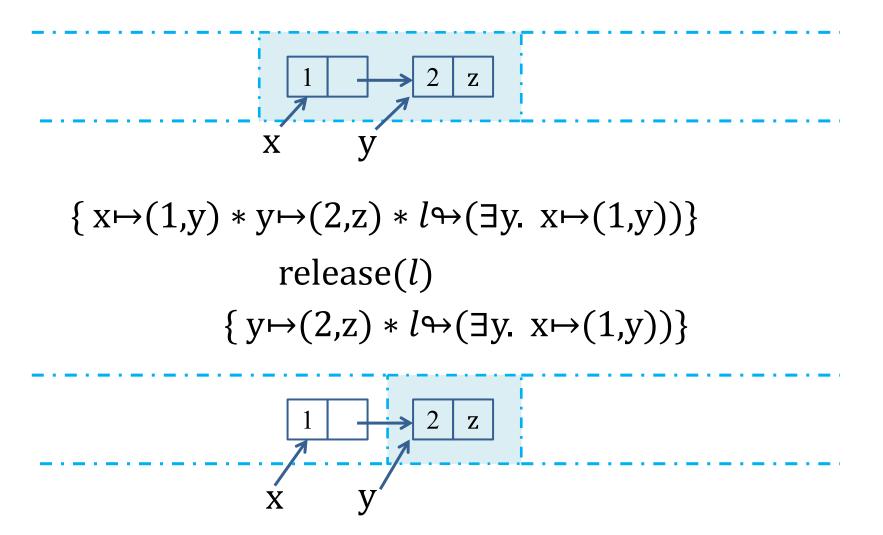
acquire the lock, gain the resource

$$\{l \hookrightarrow R\}$$
 acquire $(l)$   $\{R : l \hookrightarrow R\}$ 

give up the resource

$$\{R * l \hookrightarrow R\}$$
 release(l)  $\{l \hookrightarrow R\}$ 

#### Heaplets in Separation Logic



## Heaplets in Separation Logic

this is the resource invariant of the lock  $\{l \leftrightarrow (\exists y. \ x \mapsto (1,y))\}$ acquire the lock, acquire(l)gain the resource  $\{x\mapsto (1,y) * l \mapsto (\exists y. x\mapsto (1,y))\}$ 

#### Permission shares

- O'Hearn 2004
- Gotsman *et al.* 2007
- Hobor, Zappa Nardelli, Appel 2008

{emp} 
$$l = \text{makelock}()$$
 { $l \hookrightarrow R$ }  
{ $l \hookrightarrow R$ } acquire( $l$ ) { $R * l \hookrightarrow R$ }  
{ $R * l \hookrightarrow R$ } release( $l$ ) { $l \hookrightarrow R$ }

split the permission share into two parts

$$\frac{\pi = \pi_1 \oplus \pi_2}{\rightarrow \qquad n \mapsto \qquad n$$

$$p \mapsto_{\pi} v \quad \leftrightarrow \quad p \mapsto_{\pi_1} v * p \mapsto_{\pi_2} v$$

split the "maps-to" resourceinto two resources

#### Resource invariants for parsplit

```
void do_tasks(struct task *tasks, unsigned T) {
for (i=1; i<T; i++)
    release (tasks[i].go);
    tasks[0].f(tasks[0].closure);
    for (i=1; i<T; i++)
        acquire (tasks[i].done);
}

int thread_worker(void *arg) {
    struct task *t = (struct task *)arg;
    while (1) {
        acquire(t->go);
        t ->f(t->closure);
        release(t->done);
    }
}
```

Release the go-lock, thread\_worker acquires it and starts working

Release the done-lock, task manager resumes collecting "done" statuses

#### Resource invariants for parsplit

```
void do tasks(struct task *tasks, unsigned T) {
                                                                      int thread_worker(void *arg) {
for (i=1; i<T; i++)
                                                                       struct task *t = (struct task *)arg;
  release (tasks[i].go);
                                                                       while (1) {
 tasks[0].f(tasks[0].closure);
                                                                         acquire(t->go);
for (i=1; i<T; i++)
                                                                         t->f(t->closure);
  acquire (tasks[i].done);
                                                                         release(t->done);
                                                          result
```

Definition task\_inv  $T \neq p := \exists f \exists clo, (p.f \mapsto_{\Gamma} f) * (p.closure \mapsto_{\Gamma} clo) * \exists c, P(T, c, q, clo).$ 

We will use this definition in constructing resource invariants for **go** and **done** locks.

# Resource invariants for parsplit

```
void do_tasks(struct task *tasks, unsigned T) {
                                                                               int thread_worker(void *arg) {
   for (i=1; i<T; i++)
                                                                                 struct task *t = (struct task *)arg;
       release (tasks[i].go);
                                                                                while (1) {
     tasks[0].f(tasks[0].closure);
                                                                                   acquire(t->go);
    for (i=1; i<T; i++)
                                                                                   t->f(t->closure);
       acquire (tasks[i].done);
                                                                                   release(t->done);
                                                                   result
Definition task_inv T(q, p) = \exists f \exists clo, (p, f \mapsto_{\Gamma} f) * (p, closure \mapsto_{\Gamma} clo) * \exists c, P(T, c, q, clo).
```

Argument p is the pointer to the task block (go,done,f,closure)

# Resource invariants for parsplit

```
void do tasks(struct task *tasks, unsigned T) {
                                                                               int thread_worker(void *arg) {
   for (i=1; i<T; i++)
                                                                                struct task *t = (struct task *)arg;
       release (tasks[i].go);
                                                                                while (1) {
     tasks[0].f(tasks[0].closure);
                                                                                   acquire(t->go);
    for (i=1; i<T; i++)
                                                                                   t->f(t->closure);
       acquire (tasks[i].done);
                                                                                   release(t->done);
                                                                   result
Definition task_inv T(q, p) = \exists f \exists clo, (p, f \mapsto_{\Gamma} f) * (p, closure \mapsto_{\Gamma} clo) * \exists c, P(T, c, q, clo).
```

(existentially quantified) *clo* is the pointer to the dtask descriptor

### Resource invariants for parsplit

```
void do tasks(struct task *tasks, unsigned T) {
                                                                             int thread_worker(void *arg) {
   for (i=1; i<T; i++)
                                                                              struct task *t = (struct task *)arg;
      release (tasks[i].go);
                                                                              while (1) {
    tasks[0].f(tasks[0].closure);
                                                                                acquire(t->go);
    for (i=1; i<T; i++)
                                                                                t->f(t->closure);
      acquire (tasks[i].done);
                                                                                release(t->done);
                                                                 result
Definition task_inv T \neq p := \exists f \exists clo, (p, f \mapsto_r f) * (p, closure \mapsto_r clo) * \exists c P(T, c, q, clo)
```

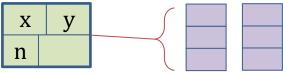
*P* is the (client-specific) task predicate (describing this slice of the *x*, *y* vectors)

# Client-specific task predicate

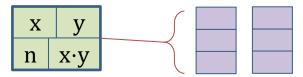
*P* is the client-specific (in this case, dot-product) predicate describing the state of the client task description

P(T, c, q, clo).

the *i*th dtask + the *i*th vector slices



This is the state when the **go** lock is released

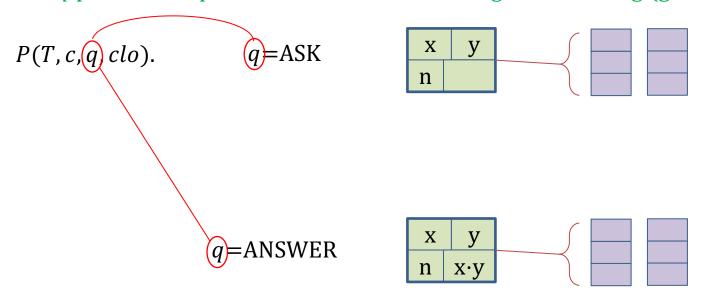


This is the state when the **done** lock is released

Definition task\_inv  $T \neq p := \exists f \exists clo, (p.f \mapsto_{\Gamma} f) * (p.closure \mapsto_{\Gamma} clo) * \exists c, P(T, c, q, clo).$ 

### Questions and answers

By releasing the **go** lock, we ask a question: what's the dot-product of this slice? By releasing the **done** lock, worker thread answers the question. The *q* parameter specifies whether we're asking or answering (go lock or done lock)

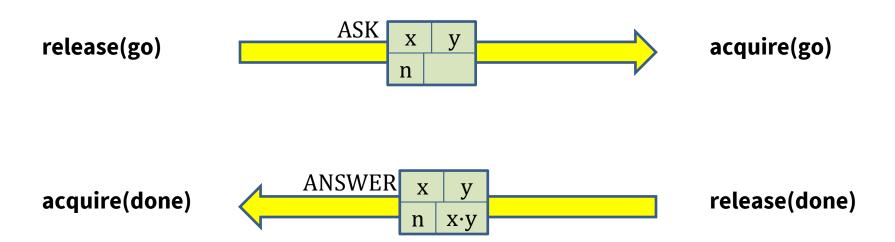


Definition task\_inv  $T \neq p := \exists f \exists clo, (p.f \mapsto_{\Gamma} f) * (p.closure \mapsto_{\Gamma} clo) * \exists c, P(T, c, q, clo).$ 

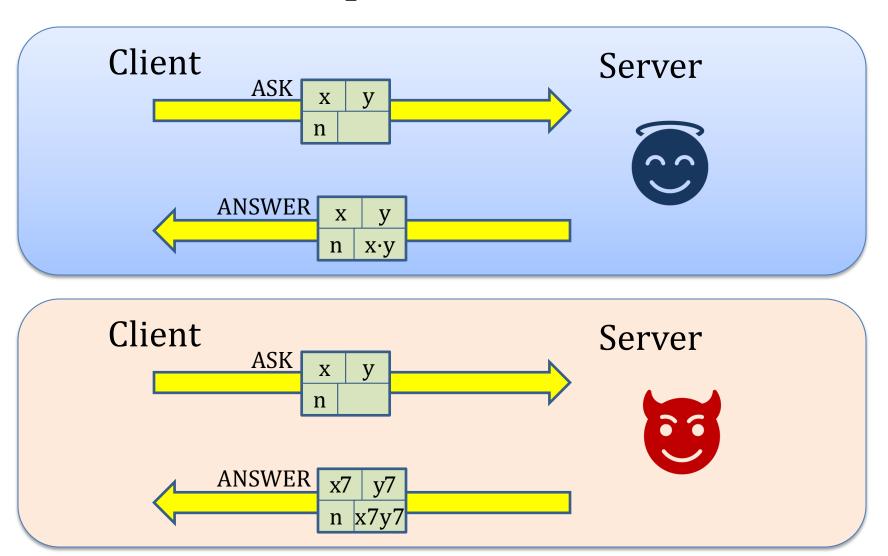
#### Resource invariants

```
do tasks
for (i=1; i<T; i++)
    release (tasks[i].go);
for (i=1; i<T; i++)
    acquire (tasks[i].done);
}</pre>
```

```
thread_worker
while (1) {
  acquire(t->go);
  t->f(t->closure);
  release(t->done);
}
```



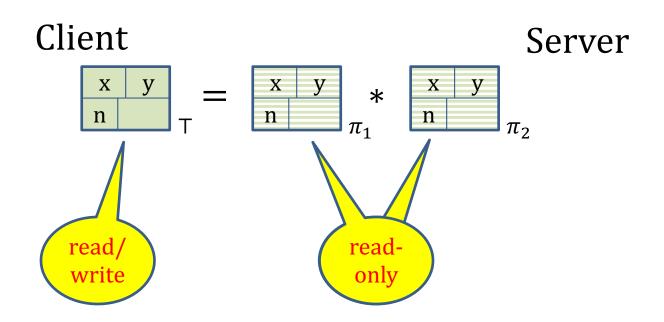
# What question did I ask?



We must prevent the worker thread from changing the question, while permitting it to fill in the answer!

# Splitting shares

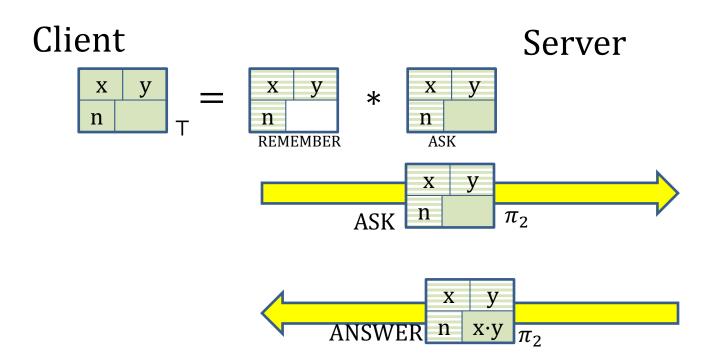
$$\frac{\pi = \pi_1 \oplus \pi_2}{p \mapsto_{\pi} v \quad \leftrightarrow \quad p \mapsto_{\pi_1} v * p \mapsto_{\pi_2} v}$$



A "writable" share may be split into two "readable" shares.

# Splitting shares

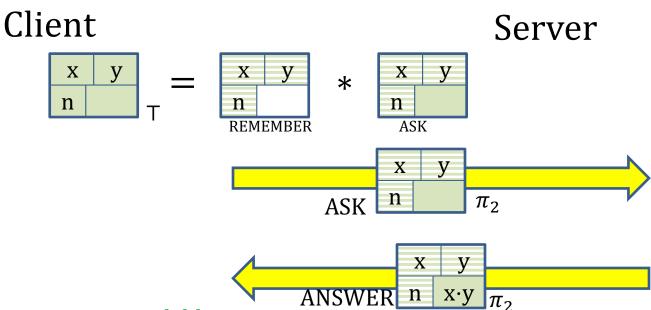
$$\frac{\pi = \pi_1 \oplus \pi_2}{p \mapsto_{\pi} v \quad \leftrightarrow \quad p \mapsto_{\pi_1} v * p \mapsto_{\pi_2} v}$$



Split a "Top" share into a "Remember" share (readable x,y,n; no-access result) and an "Ask/Answer" share (readable x,y,n; writable result)

# Splitting shares

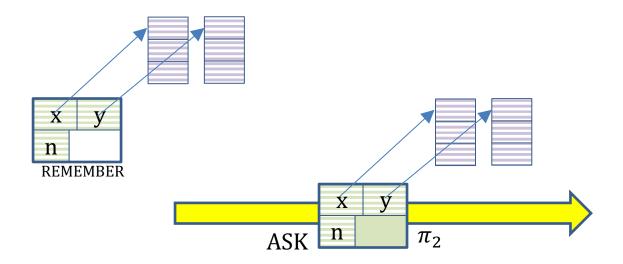
$$\frac{\pi = \pi_1 \oplus \pi_2}{p \mapsto_{\pi} v \quad \leftrightarrow \quad p \mapsto_{\pi_1} v * p \mapsto_{\pi_2} v}$$



Fact: If you join two readable

shares, the values must be the same!

### Must also split shares of . . .



Not just the pointers *x*, *y* but also the pointed-to data must be split into "Remember" share and "Ask/Answer" share

#### The functional model

Floating-point add is not associative, so cannot prove n

$$\sum_{i=0}^{n} x_i \cdot y_i$$

Instead we prove

$$\sum_{t=0}^{T} \sum_{i=\delta_{t}}^{\delta_{t+1}} x_{i} \cdot y_{i}$$

and let the upper-layer proofs worry about accuracy of associativity

Q.E.D.

That's my proof!

In Coq it's a bit more verbose.

# But does the program work?

```
$ time ./dotprod 1000000 4 10000
N=1000000 T=4 R=10000

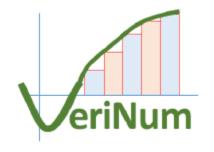
real    10.415s
user    40.703s
sys    0.140s
speedup 3.9 with 4 processors
```

# Lines of program and proof

	C lines	Coq lines	Ratio
dotprod client	58	799	14:1
API	10	148	15:1
parallelizer	51	493	10:1

Ugh! Too much.

#### Where to find it



https://github.com/VeriNum/pardotprod

C program: parsplit.h, parsplit.c, dotprod.h, dotprod.c

Specifications: spec\_parsplit.v, and dotprod\_spec within verif\_dotprod.v

Proofs: verif\_parsplit.v, verif\_dotprod.v

#### Conclusion

 Barrier synchronization is a simple parallel programming model, easy to implement with ordinary semaphores, quite useful in many parallel applications

 It's straightforward to specify and verify barriersynch. parallelism in VST

 We have verified correctness of a simple task manager, useful for T-way fork-join parallelism.