SOFTWARE COMBINING TO MITIGATE **MULTITHREADED MPI CONTENTION**

Argonne National Laboratory

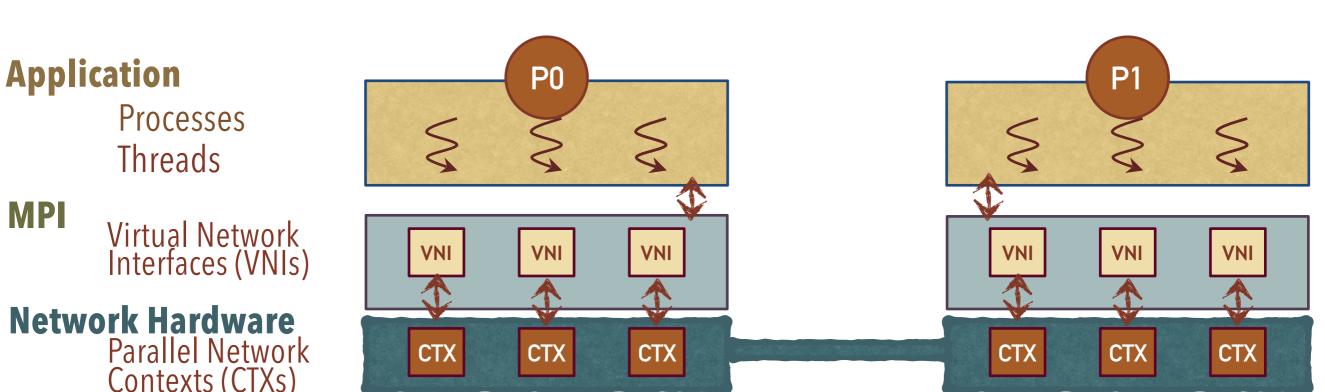
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HYBRID MPI + THREADS PROGRAMMING

Fundamentals and Scope

CONTEXT: THREADS --+ MPI --+ NETWORK INTERFACE



- Contexts (CTXs) TCP sockets Libfabric endpoints UCX workers

APPLICATION THREADS-MPI INTERACTION

MPI_THREAD_SINGLE

MPI_THREAD_FUNNELED

MPI_THREAD_SERIALIZED

MPI_THREAD_MULTIPLE

```
for (i=0; i<100; i++)
</pre>
```

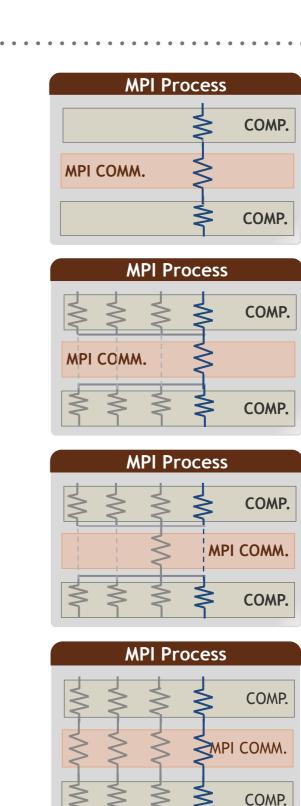
```
compute(buf[i]);
MPI_Send(&buf[i],...);
```

#pragma omp parallel for
for (i=0; i<100; i++)
 compute(buf[i]);</pre>

MPI_Send(buf,...);

#pragma omp parallel for for (i=0; i<100; i++) { compute(buf[i]); #pragma omp critical MPI_Send(&buf[i],...);

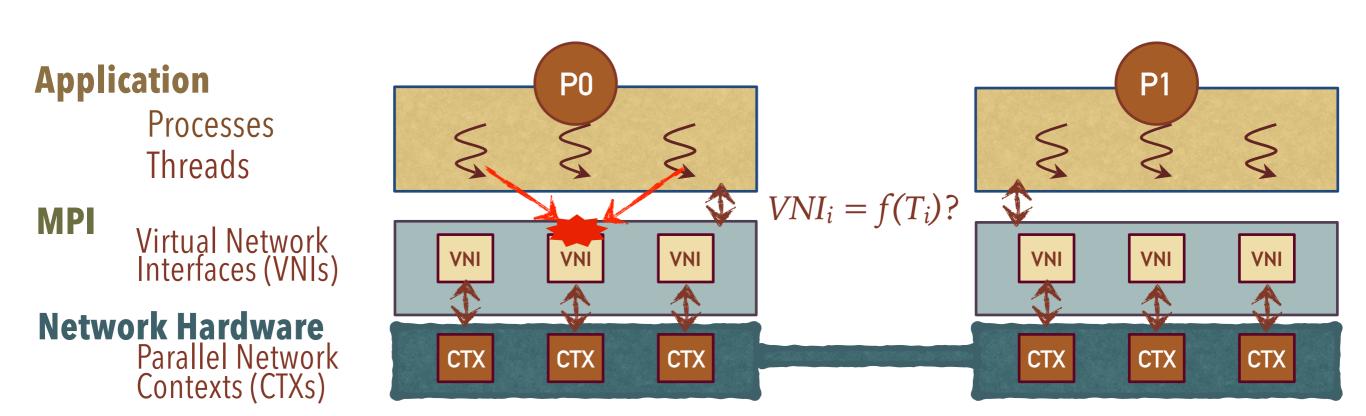
#pragma omp parallel for for (i=0; i<100; i++) { compute(buf[i]); MPI_Send(&buf[i],...);



APPLICATION THREADS-MPI INTERACTION

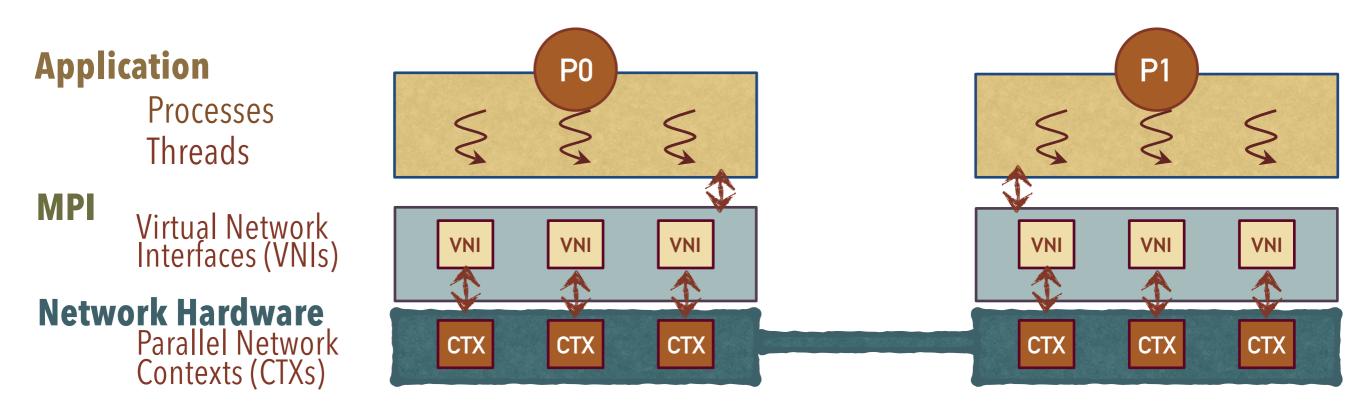
| MPI_THREAD_SINGLE | <pre>for (i=0; i<100; i++) { compute(buf[i]); MPI_Send(&buf[i],); }</pre> | MPI COMM. COMP. COMP. |
|---|--|--|
| MPI_THREAD_FUNNELED | <pre>#pragma omp parallel for for (i=0; i<100; i++) compute(buf[i]); MPI_Send(buf,);</pre> | MPI COMM. MPI COMM. COMP. |
| MPI 3.1 requirement Thread safety (mutual exclusion) Progress (blocking calls only block caller thread) | <pre>#pragma omp parallel for for (i=0; i<100; i++) { compute(buf[i]); #pragma omp critical MPI_Send(&buf[i],); }</pre> | MPI Process COMP. MPI COMM. COMP. |
| MPI_THREAD_MULTIPLE | <pre>#pragma omp parallel for for (i=0; i<100; i++) { compute(buf[i]); MPI_Send(&buf[i],); }</pre> | MPI Process COMP. MPI COMM. COMP. |

NETWORK RESOURCES: MAJOR HOT SPOT



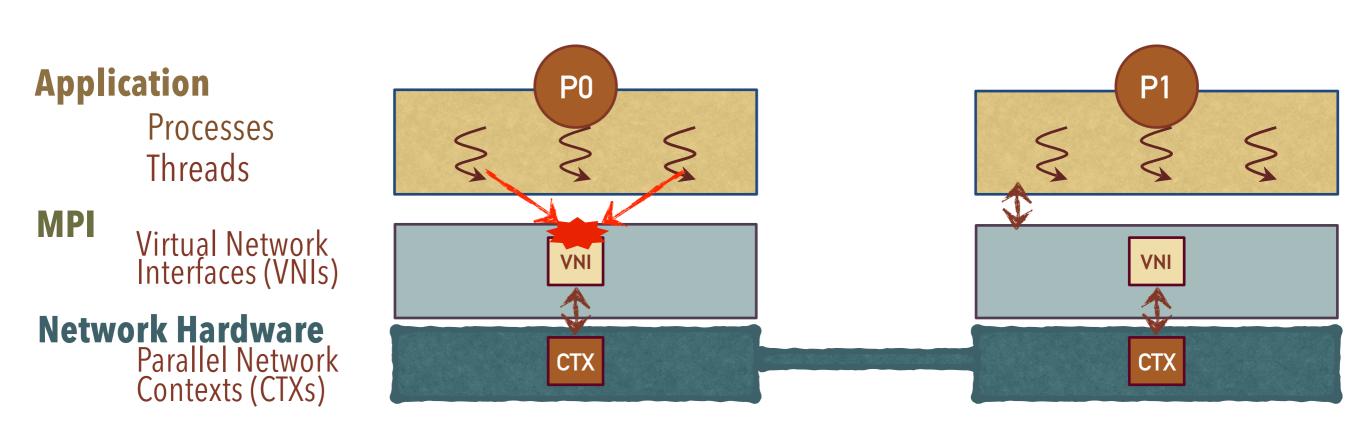
- Not always possible to guarantee independent VNIs for threads
 - Insufficient network resources (multiplexing necessary)
 - Application constraints (e.g., load balancing network traffic across communicators, tags, etc.)
 - Lack of user control over thread-VNI mapping
 - Current MPI libraries best effort mapping (blindly mapping comms/tags/wins to VNIs)
 - MPI Endpoints still not standard

CHALLENGE: NO CONTROL OVER CONCURRENCY



- Threads belong to the user application, not MPI
- Synchronization algorithms that assume N threads won't work

SIMPLIFICATION: SINGLE VNI FOR ALL THREADS



HISTORY

MPI Thread Safety Models

THREAD SAFETY MODELS

- Abstract models
- Capture how thread safety is managed

- Critical section granularity
- Access order (e.g., fairness)
- Wait on completion synchronization model (e.g., spin on flag, lock acquisition, condition variable, etc.)
- Ideally void of technical details (e.g., locking algorithm, atomic operations, etc.)
- Examples of models
 - Global lock
 - Per-object locking
 - Lockless offloading

```
#pragma omp parallel for
for (i=0; i<100; i++) {
    compute(buf[i]);
    MPI_Isend(&buf[i],..., &req[i]);
}
#pragma omp parallel for
for (i=0; i<100; i++)
    MPI_Wait(..., &req[i]);
```

APPLICATION

MPI_Isend (...,*req) {

request_create(req);
network_isend(...,req);





}

}

while (!completed(req)) {
 network_progress();

MP

}
free(req);
req = REQUEST_NULL;

```
#pragma omp parallel for
for (i=0; i<100; i++) {
    compute(buf[i]);
    MPI_Isend(&buf[i],..., &req[i]);
}
#pragma omp parallel for
for (i=0; i<100; i++)
    MPI_Wait(..., &req[i]);
```

Not thread-safe. Threads can corrupt

- 1. Hardware network state
- 2. User buffers
- 3. Request objects

```
MPI_Isend (...,*req) {
```

```
request_create(req);
network_isend(...,req);
```

```
MPI_Wait (...,*req) {
```

}

}

```
while (!completed(req)) {
    network_progress();
```

```
}
free(req);
req = REQUEST_NULL;
```

```
4. ..
```

```
#pragma omp parallel for
```

```
for (i=0; i<100; i++) {
    compute(buf[i]);
    MPI_Isend(&buf[i],..., &req[i]);
}
#pragma omp parallel for
for (i=0; i<100; i++)
    MPI_Wait(..., &req[i]);</pre>
```

Simplest MPI-compliant design

- Single API level lock (L)
- Release lock in blocking calls to let other threads progress

```
MPI_Isend (...,*req) {
    lock_acquire(L);
    request_create(req);
    network_isend(...,req);
    lock_release(L);
}
```

```
MPI_Wait (...,*req) {
    lock_acquire(L);
    while (!completed(req)) {
        network_progress();
        if (!completed(req)) {
            lock_release(L);
            /*pause/yield*/
            lock_acquire(L);
            }
        }
        free(req);
        req = REQUEST_NULL;
        lock_acquire(L);
    }
}
```

```
#pragma omp parallel for
```

```
for (i=0; i<100; i++) {
    compute(buf[i]);
    MPI_Isend(&buf[i],..., &req[i]);
}
#pragma omp parallel for
for (i=0; i<100; i++)
    MPI_Wait(..., &req[i]);</pre>
```

Simplest MPI-compliant design

- Single API level lock (L)
- Release lock in blocking calls to let other threads progress

```
• Value
```

- Simplicity (less error prone, easy to maintain)
- Low overheads under zero contention
- Drawbacks
 - No internal concurrency
 - Prone to serialization and contention

```
- Lack of asynchrony due to lock acquisitions
```

```
MPI_Isend (...,*req) {
    lock_acquire(L);
    request_create(req);
    network_isend(...,req);
    lock_release(L);
}
```

```
MPI_Wait (...,*req) {
    lock_acquire(L);
    while (!completed(req)) {
        network_progress();
        if (!completed(req)) {
            lock_release(L);
            /*pause/yield*/
            lock_acquire(L);
            }
        }
        free(req);
        req = REQUEST_NULL;
        lock_acquire(L);
    }
}
```

FINE-GRAINED LOCKING MODELS

```
#pragma omp parallel for
```

```
for (i=0; i<100; i++) {
    compute(buf[i]);
    MPI_Isend(&buf[i],..., &req[i]);
}
#pragma omp parallel for
for (i=0; i<100; i++)
    MPI_Wait(..., &req[i]);</pre>
```

- Eliminate the coarse-grained global lock
 - Independent objects … separate critical sections
 - Single lock, per-object locks, locks per class of objects, etc.
- Value
 - More internal concurrency ---> less serialization/contention
- Drawbacks
 - Complexity and overheads grow with the number of critical sections
 - Hot spots still possible (all threads may funnel traffic through same VNI)
 - Lack of asynchrony due to lock acquisitions
- Instances: Dózsa et al. [1], Balaji et al. [2], Kandalla et al. [3]

Gábor Dózsa et al. Enabling Concurrent Multithreaded MPI Communication on Multicore Petascale Systems. (EuroMPI'10)
 Pavan Balaji et al. Fine-Grained Multithreading Support for Hybrid Threaded MPI Programming. IJHPCA (2010)
 Krishna Kandalla et al. Optimizing Crow MPI and SUMEN Contracts Obselve for Open VO 2

```
[3] Krishna Kandalla et al. Optimizing Cray MPI and SHMEM Software Stacks for Cray-XC Supercomputers based on Intel KNL Processors. Cray User Group (2016).
```

```
MPI_Isend (...,*req) {
    lock_acquire(req_L);
    request_create(req);
    lock_release(req_L);
    lock_acquire(net_L);
    network_isend(...,req);
    lock_release(net_L);
}
```

```
MPI_Wait (...,*req) {
    while (!completed(req)) {
        lock_acquire(net_L);
        network_progress();
        lock_release(net_L);
        /*pause/yield*/
    }
    lock_acquire(req_L);
    free(req);
    req = REQUEST_NULL;
    lock_acquire(req_L);
```

CONTENTION MANAGEMENT MODELS

```
#pragma omp parallel for
```

```
for (i=0; i<100; i++) {
    compute(buf[i]);
    MPI_Isend(&buf[i],..., &req[i]);
}
#pragma omp parallel for
for (i=0; i<100; i++)</pre>
```

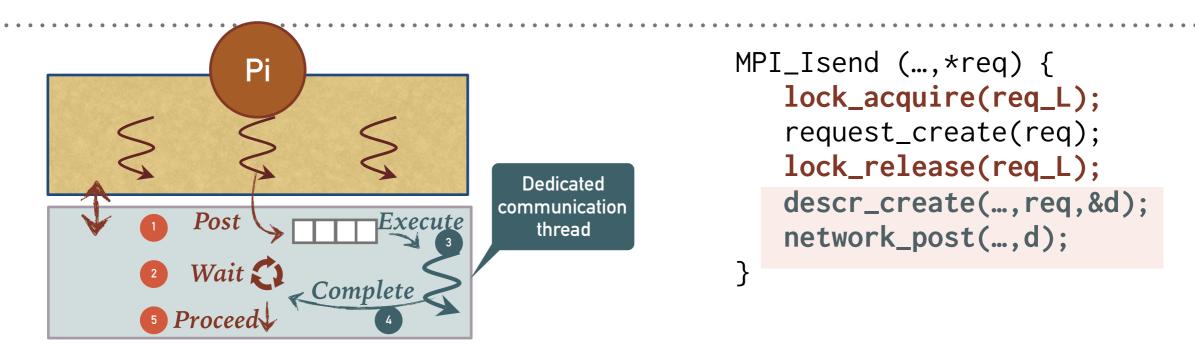
```
MPI_Wait(..., &req[i]);
```

- Advanced critical section management on contention
 - Orthogonal to critical section granularity
 - Goal: maximize work inside critical sections
 - Example: O(1) instead of O(N) blind wakeup
- Value
 - No added complexity
 - Demonstrated high performance even with coarse-grained locking
- Drawbacks
 - Serialization and lack of concurrency
 - Lack of asynchrony due to lock acquisitions
- Instances: Dang et al [1] and Amer et al. [2]

[1] Vu Dang et al. Advanced Thread Synchronization for Multithreaded MPI Implementations. (CCGRID'17)
 [2] Abdelhalim Amer et al. Lock Contention Management in Multithreaded MPI. ACM Transactions on Parallel Computing (TOPC) 2019

```
MPI_Isend (...,*req) {
         lock_acquire(L);
         request_create(req);
         network_isend(...,req);
         lock_release(L);
      }
                            Just for illustration
                            purposes. Incomplete and
                            incorrect. See Dang et al.
                            [1] for complete algorithm.
      MPI_Wait (...,*req) {
         lock_acquire(L);
         if (!completed(req))
             cond_wait(req.c, L);
wakeup
         while (!completed(req)) {
             req2 = network_cq_poll();
             cond_signal(req2.c);
         free(req);
          req = REQUEST_NULL;
          lock_acquire(L);
```

LOCKLESS OFFLOADING MODEL



on performance under contention

• Offloading to dedicated communication threads

- Application threads offload operations to communication threads
- Lockless: 1) post network operations, 2) wait on a flag on synchronization
- Asynchronous progress (more than just a thread safety model)
 Used as upper bound
- Value: Highest possible concurrency
- Drawbacks
 - Must sacrifice CPU resources
 - Forces enqueue operation even with zero contention
- Instances: Kumar et al. [1], Vaidyanathan et al. [2]

Sameer Kumar et al. PAMI: A Parallel Active Message Interface for the Blue Gene/Q Supercomputer. (IPDPS '12).
 Karthikeyan Vaidyanathan et al. Improving Concurrency and Asynchrony in Multithreaded MPI Applications Using Software Offloading. (SC'15)

```
MPI_Wait (...,*req) {
```

```
while (!completed(req)) {
    /* spin on the
    Request local flag*/
}
lock_acquire(req_L);
free(req);
req = REQUEST_NULL;
lock_acquire(req_L);
```

HISTORICAL SUMMARY

| | | Fine-Grained Locking | Lock Contention Management | Offloading |
|------------------------------------|--------------------|---|--|--|
| Nonblocking | No Contention | Overhead and complexity grows with the number of critical sections | Simplest and lowest overhead | High offloading overhead |
| Operations Waiting in | High Contention | Performance improvements from increased concurrency | High performance from high throughput locks | High performance proportional to queue efficiency |
| | No Contention | Overhead and complexity grows with the number of critical sections | Low overhead | Lowest overhead (only check local flag) |
| Blocking Operations | High Contention | Bad performance from blind lock ownership passing | High performance O(1) wakeup . Overhead of progress calls | Lowest overhead (only check local flag, no progress calls) |
| Asynchrony of Nonblocking Calls | | May block on lock acquisition | May block on lock acquisition | Asynchronous |
| - | PU onsumption | Nothing special | Nothing special | CPU resources grow with the number of dedicated threads |
| Hardware | Awareness | Can be Agnostic | Necessary for high throughput locks | Can be agnostic |

NEW SOFTWARE COMBINING MODELS (1/2) Software Combining

| | • • • • • • • • • • • • • • • • | | | | |
|--------------------------------------|---------------------------------|---|--|---|---|
| | | Fine-Grained Locking | Lock Contention Management | Offloading | CSync |
| Nonblocking | No Contention | Overhead and complexity grows with the number of critical sections | Simplest and lowest overhead | High offloading overhead | High offloading overhead |
| Operations Waiting in Blocking | High Contention | Performance improvements from increased concurrency | High performance from high throughput locks | High performance proportional to queue efficiency | High performance proportional to queue efficiency |
| | No Contention | Overhead and complexity grows with the number of critical sections | Low overhead | Lowest overhead (only check local flag) | Low overhead |
| Operations | High Contention | Bad performance from blind lock ownership passing | High performance O(1) wakeup . Overhead of progress calls | Lowest overhead (only check local flag, no progress calls) | Wasteful |
| | f Nonblocking lls | May block on lock acquisition | May block on lock acquisition | Asynchronous | May block on pending operation or lock acquisition |
| - | PU onsumption | Nothing special | Nothing special | CPU resources grow with the number of dedicated threads | Nothing special |
| Hardware | Awareness | Can be Agnostic | Necessary for high throughput locks | Can be agnostic | Can be agnostic |

NEW SOFTWARE COMBINING MODELS (2/2) Software Combining

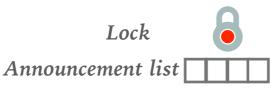
| | | Fine-Grained Locking | Lock Contention Management | Offloading | CSync | LockQ |
|---|-----------------------|---|--|---|---|---|
| N Nonblocking | No Contention | Overhead and complexity grows with the number of critical sections | Simplest and lowest overhead | High offloading overhead | High offloading overhead | Simple and low overhead |
| Operations High Content No Conte Waiting in | High Contention | Performance improvements from increased concurrency | High performance from high throughput locks | High performance proportional to queue efficiency | High performance proportional to queue efficiency | High performance proportional to queue efficiency |
| | No Contention | Overhead and complexity grows with the number of critical sections | Low overhead | Lowest overhead (only check local flag) | Low overhead | Low overhead |
| Blocking Operations | High Contention | Bad performance from blind lock ownership passing | High performance O(1) wakeup . Overhead of progress calls | Lowest overhead (only check local flag, no progress calls) | Wasteful | Not wasteful but unsatisfactory |
| Asynchrony o Ca | f Nonblocking alls | May block on lock acquisition | May block on lock acquisition | Asynchronous | May block on pending operation or lock acquisition | Asynchronous |
| - | PU onsumption | Nothing special | Nothing special | CPU resources grow with the number of dedicated threads | Nothing special | Nothing special |
| Hardware | Awareness | Can be Agnostic | Necessary for high throughput locks | Can be agnostic | Can be agnostic | Can be agnostic |

SOFTWARE COMBINING

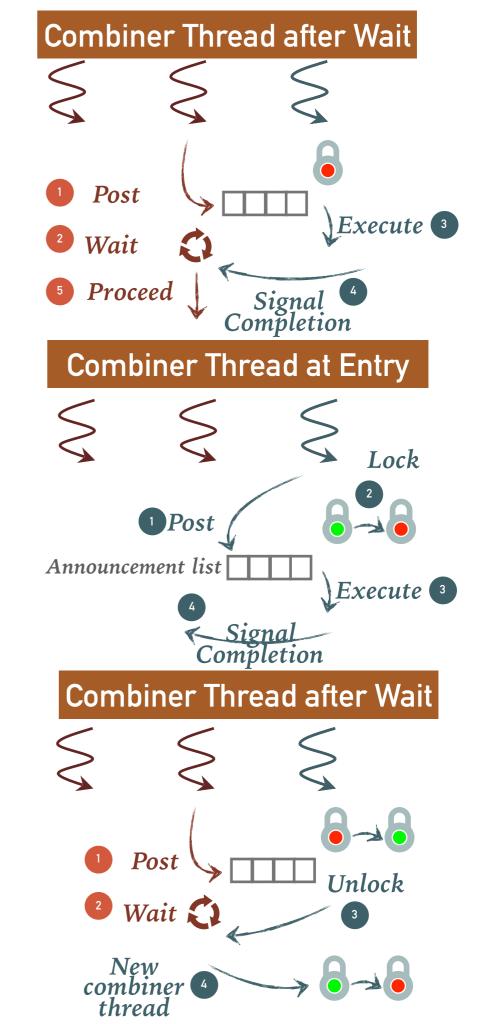
Description and Example

SOFTWARE COMBINING

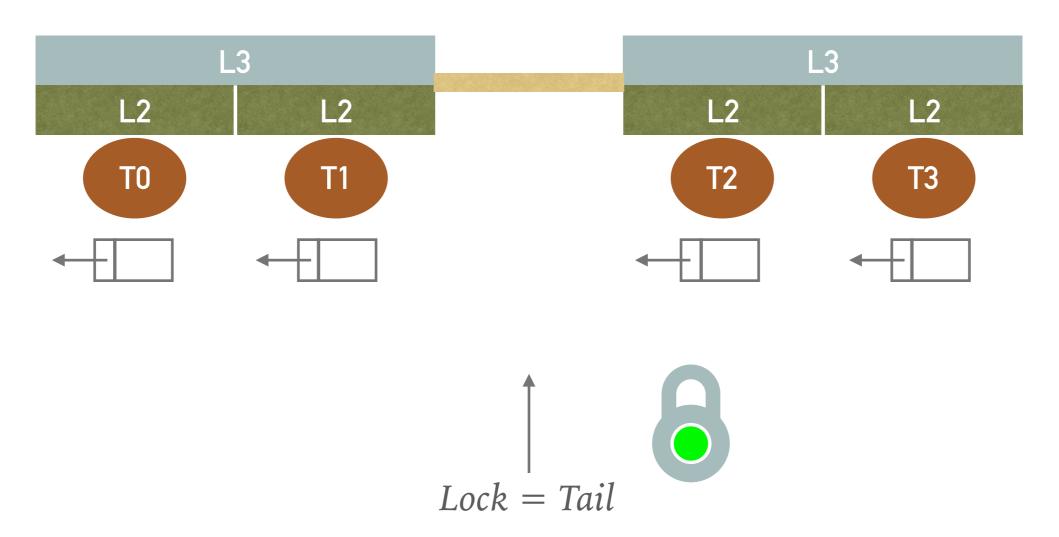
- Goal: scalability
- Principle



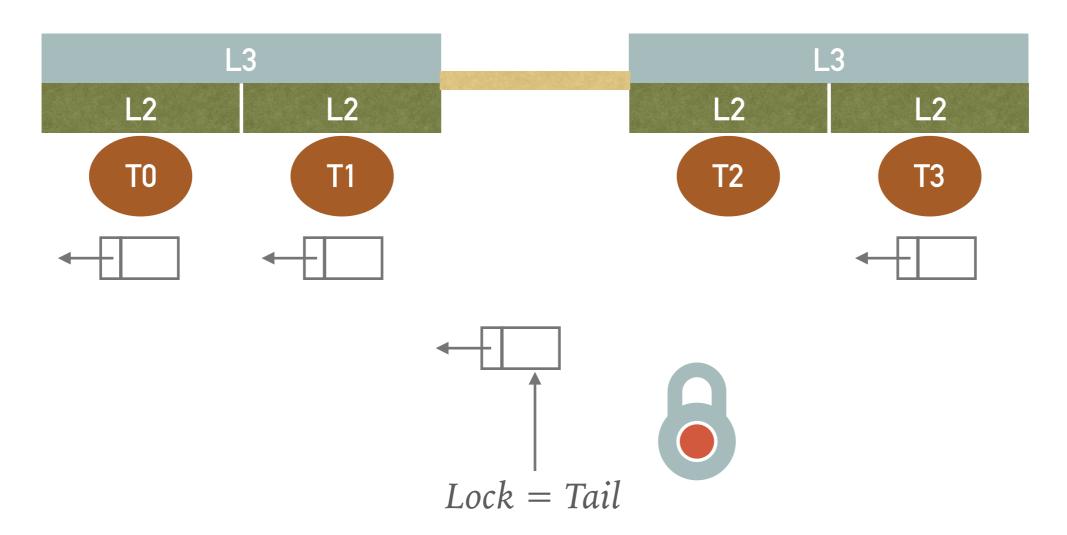
- Lock + announcement list
- Waiters announce their work requests
- Lock owner combines them (executes on behalf of waiters)
- Most implementations are hardware agnostic
- Several implementations
- Many scalable applications especially for concurrent data structures
 - Lists, queues, stacks, etc.



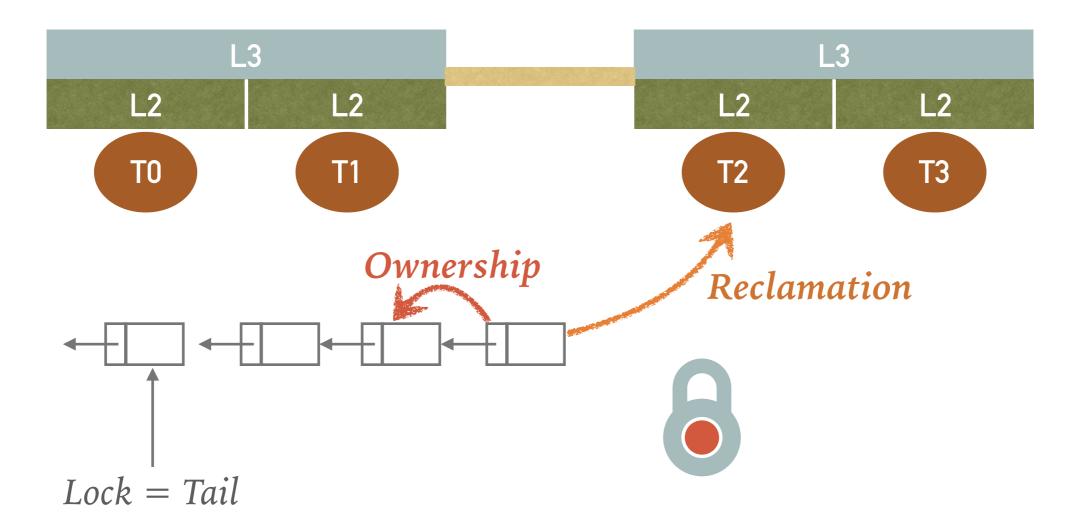
- Probably the most popular mutual exclusion algorithm (over 1.5K citations!)
- Mellor-Crummey & Scott (1991): "Algorithms for scalable synchronization on shared-memory multiprocessors". *ACM Transactions on Computer Systems*.
- Queue-based lock algorithm



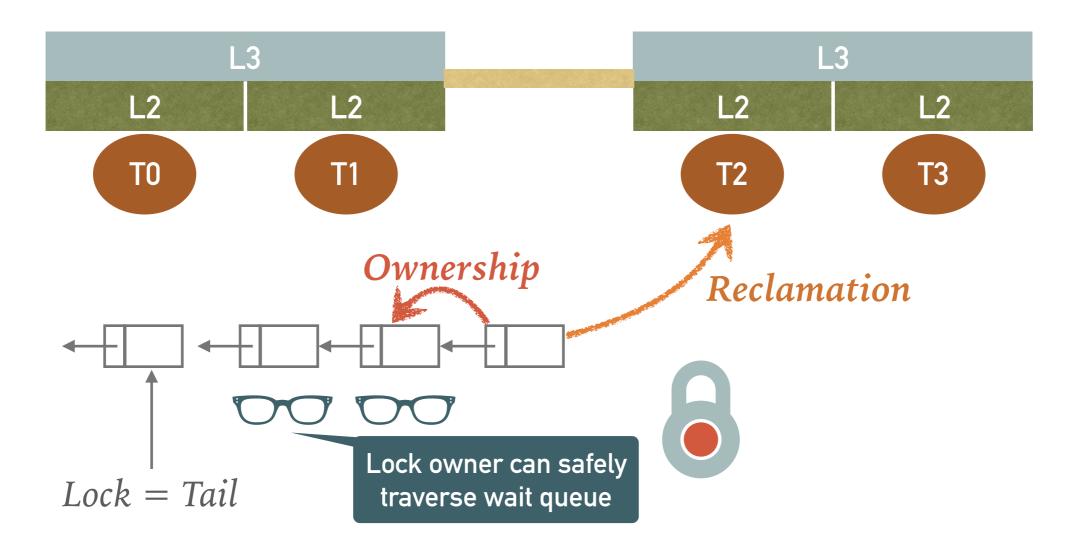
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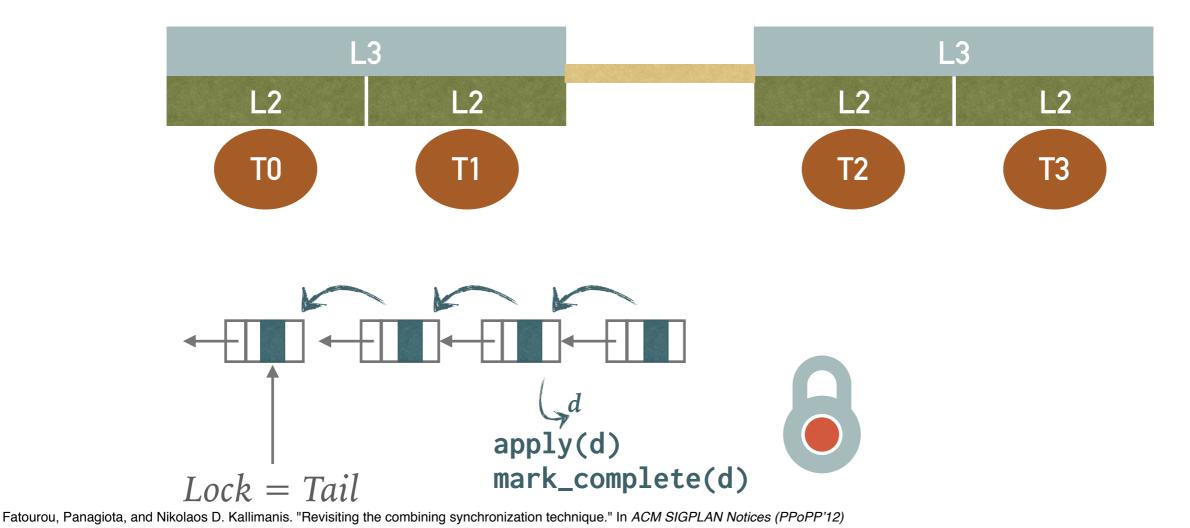
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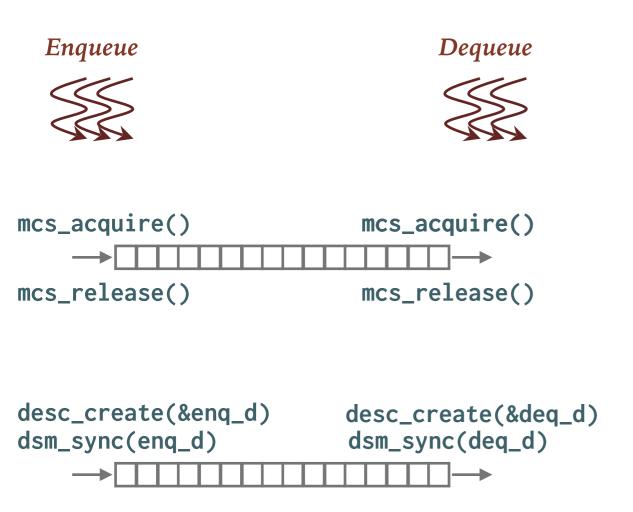


- Extend an MCS queue node with a **request** or **work descriptor**
- Wait queue has two purposes
 - 1. Holds waiting thread nodes as in MCS
 - 2. Works as an **announcement list** to publish work descriptors
- Lock owner executes operations found in the queue

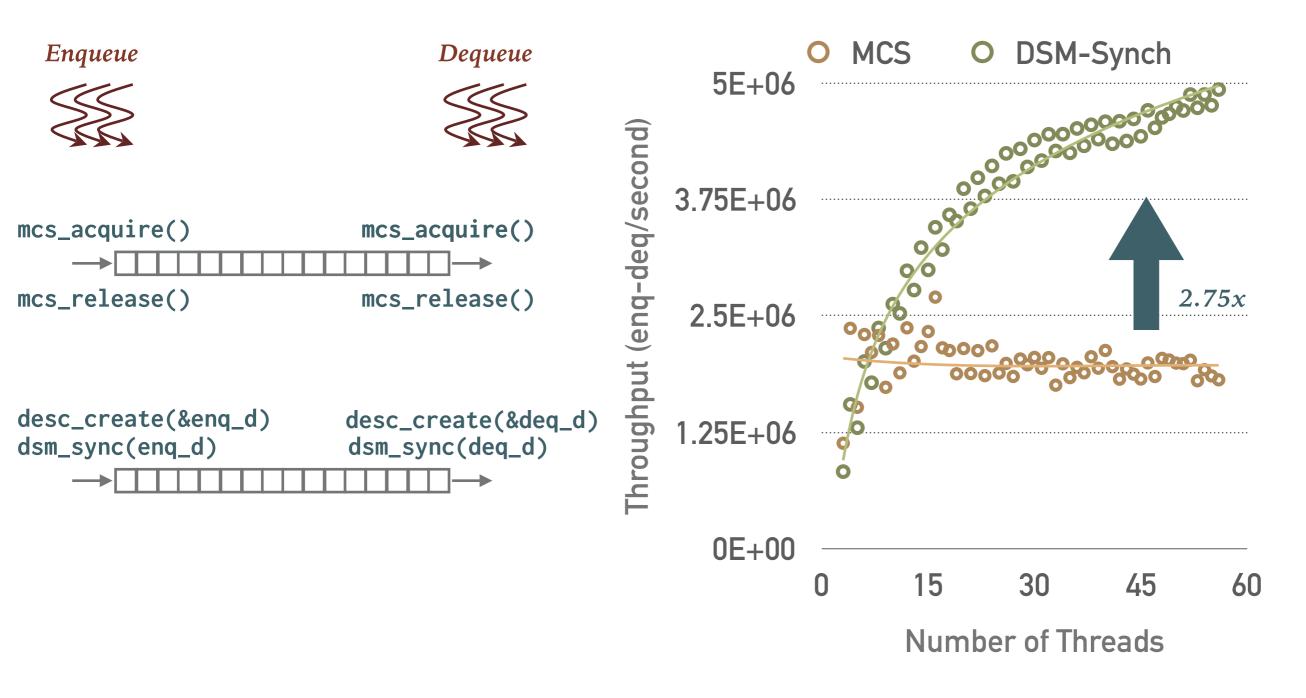


PERFORMANCE EXAMPLE WITH A FIFO QUEUE

.



PERFORMANCE EXAMPLE WITH A FIFO QUEUE



Enq/Deq throughput on 56-Core Intel Skylake at 2.5GHz

CSYNC AND Lockq Models

Software Combining at the Rescue

CSYNC: DIRECT SOFTWARE COMBINING APPLICATION

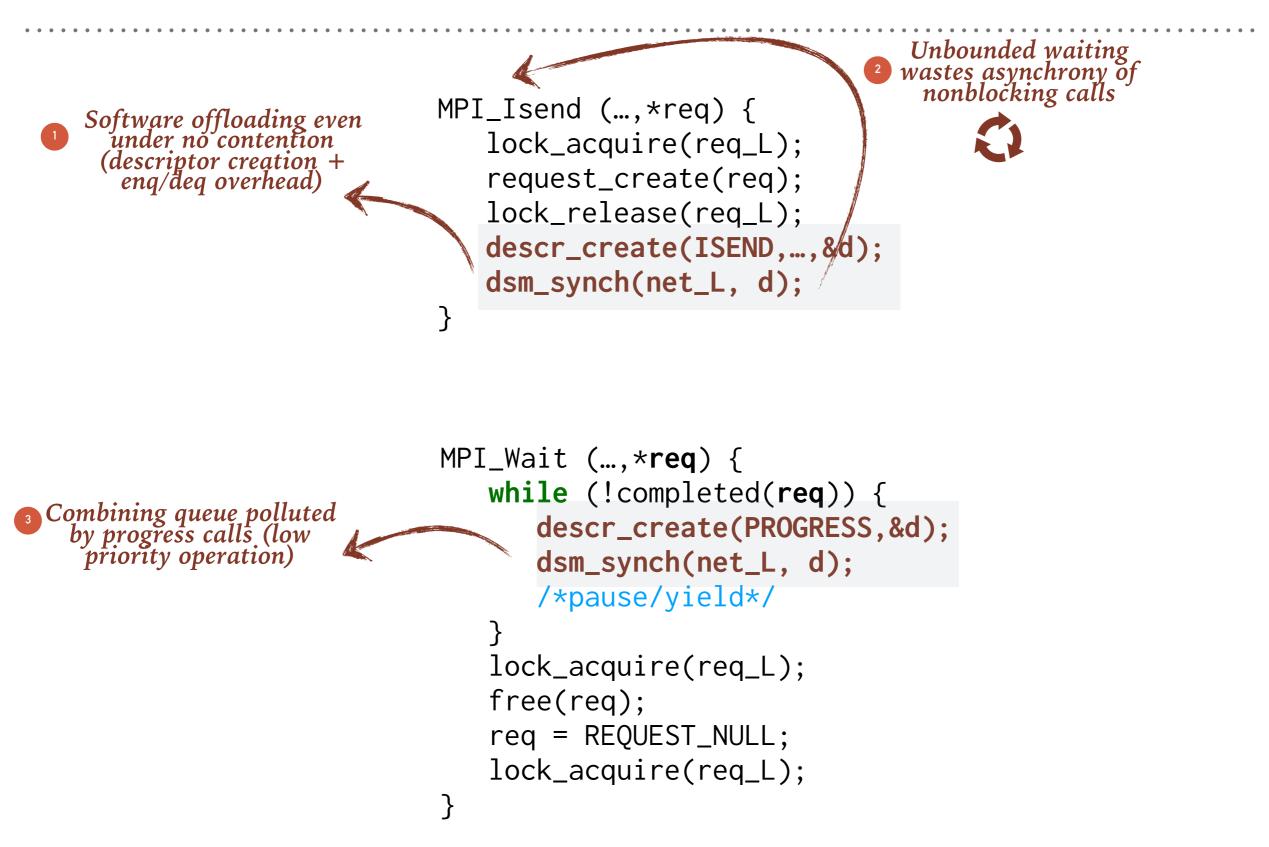
```
MPI_Isend (...,*req) {
                              MPI_Isend (...,*req) {
   lock_acquire(req_L);
                                  lock_acquire(req_L);
   request_create(req);
                                  request_create(req);
   lock_release(req_L);
                                  lock_release(req_L);
   lock_acquire(net_L);
                                  descr_create(ISEND,...,&d);
   network_isend(...,req);
                                  dsm_synch(net_L, d);
   lock_release(net_L);
}
MPI_Wait (...,*req) {
   while (!completed(req))
                               MPI_Wait (...,*req) {
                                  while (!completed(req)) {
   {
      lock_acquire(net_L);
                                     descr_create(PROGRESS,&d);
      network_progress();
                                     dsm_synch(net_L, d);
      lock_release(net_L);
                                     /*pause/yield*/
      /*pause/yield*/
                                  }
                                  lock_acquire(req_L);
                                  free(req);
   lock_acquire(req_L);
                                  req = REQUEST_NULL;
   free(req);
   reg = REQUEST_NULL;
                                  lock_acquire(req_L);
   lock_acquire(req_L);
                               }
```

}

CSYNC: DIRECT SOFTWARE COMBINING APPLICATION

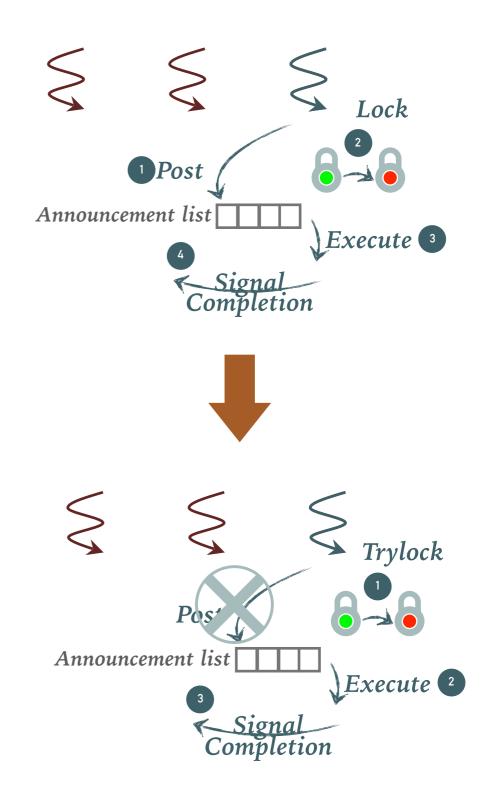
```
MPI_Isend (...,*req) {
                                                                apply (*d) {
                               MPI_Isend (...,*req) {
   lock_acquire(req_L);
                                                                   switch(d->op) {
                                  lock_acquire(req_L);
   request_create(req);
                                                                   case ISEND:
                                  request_create(req);
   lock_release(req_L);
                                                                     network_isend(...);
                                  lock_release(req_L);
   lock_acquire(net_L);
                                                                   case PROGRESS:
                                  descr_create(ISEND,...,&d);
   network_isend(...,req);
                                                                     network_progress(...);
                                  dsm_synch(net_L, d);
   lock_release(net_L);
                                                                   }
}
                                                           Combiner thread internal call
MPI_Wait (...,*req) {
   while (!completed(req))
                               MPI_Wait (...,*req) {
                                  while (!completed(req)) {
      lock_acquire(net_L);
                                      descr_create(PROGRESS,&d)
      network_progress();
                                      dsm_synch(net_L, d);
                                      /*pause/yield*/
      lock_release(net_L);
      /*pause/yield*/
                                   }
                                   lock_acquire(req_L);
                                   free(req);
   lock_acquire(req_L);
                                   req = REQUEST_NULL;
   free(req);
   reg = REQUEST_NULL;
                                   lock_acquire(req_L);
   lock_acquire(req_L);
                               }
```

LIMITATIONS OF CSYNC



ELIMINATING UNNECESSARY OFFLOADING

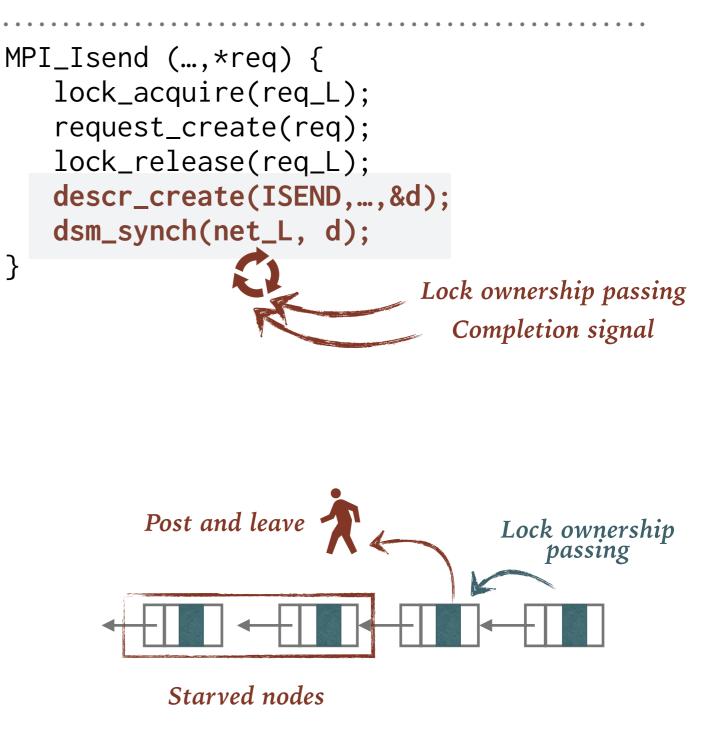
- Don't post a work descriptor unconditionally
- Use an empty node (no descriptor creation)
- Try to acquire the lock
 - If successful
 - Combine operations
 - If threshold of combining reached, enqueue my operation
 - Else execute operation and then leave
 - Lock acquisition failure
 - Post work descriptor
 - Wait



POST AND LEAVE BREAKS THE SYSTEM

}

- Keeping nonblocking calls asynchronous improves latency hiding and overlapping opportunities
- Only way is to leave after posting a work descriptor on lock acquisition failure
 - Thread gives up lock ownership passing and combining responsibilities
 - Work descriptors and threads may starve in the queue



SOLUTION: DECOUPLED LOCK-LIST STRUCTURE

- Fundamental issue is coupled locklist data structure
- Decoupling data structure
 - No waiting necessary in a nonblocking call
 - Post and leave, and thus keep nonblocking calls asynchronous
- Flexibility
 - Any lock algorithm can be used
 - Any concurrent list data structure can be used

```
MPI_Isend (...,*req) {
   lock_acquire(req_L);
   request_create(req);
   lock_release(req_L);
   if (trylock(net_L)) {
      combine();
      network_isend(...);
      lock_release(net_L);
   } else {
      descr_create(ISEND,...,&d);
      post(d);
   }
}
                     Trylock
                                algorithm
```

RACES AND MPI COMPLETION SEMANTICS

- Work descriptors may never be executed due to races
- Solution: rely on MPI completion semantics as last resort
 - Request completion: MPI_Wait and MPI_Test family
 - RMA: synchronization calls (e.g., MPI_Win_flush, MPI_Win_unlock, etc.)

```
T1
                      T2
                     combine()
                     network_isend()
Fail--->trylock()
                     lock_release()
     desc_create(d)
                    /* Leave */
     post(d)
                         d may never be
      /* Leave */
                           executed
  MPI_Wait (...,*req) {
     while (!completed(req))
     {
        lock_acquire(net_L);
        combine();
        network_progress();
        lock_release(net_L);
        /*pause/yield*/
  }
```

PUTTING THEM TOGETHER: LOCKQ AND DETAILS

• LockQ

- Avoids unnecessary offloading under no contention
- Keeps nonblocking asynchronous
- Combing queue is not polluted by progress calls

• Combining thread doing too much?

- User-controllable combining threshold
- Combining responsibility changes over time

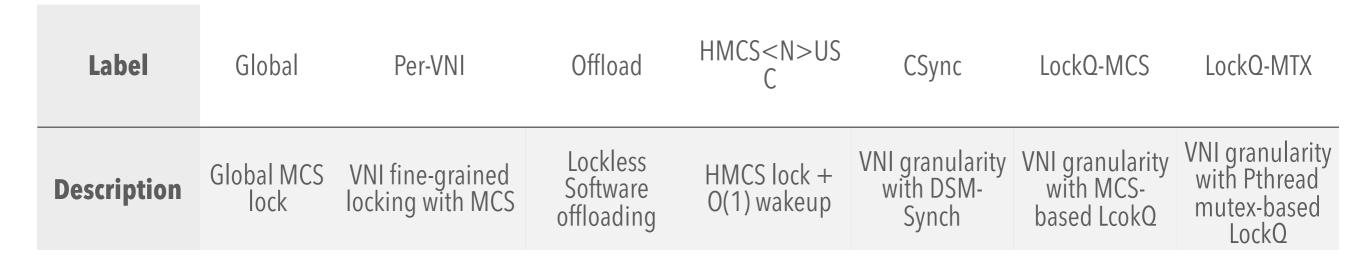
How about nonblocking progress calls like MPI_Test?

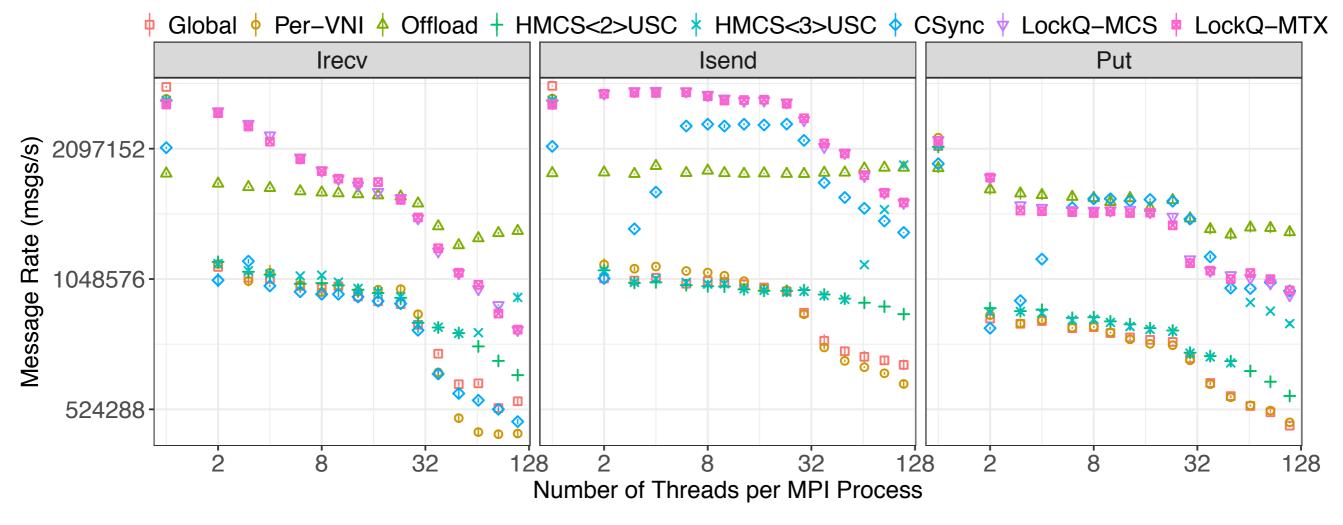
- Asynchronous with trylock
- Exponential backoff to reduce contention
- Are nonblocking calls made blocking with last resort combining?
 - Yes, but rare in practice

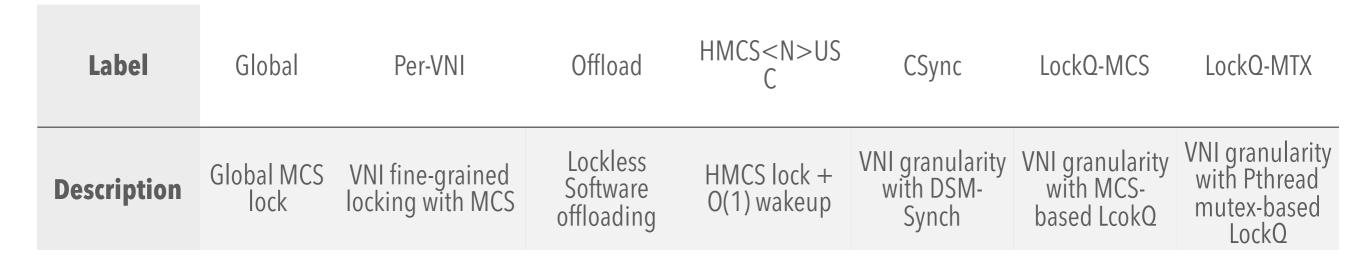
```
MPI_Isend (...,*req) {
   lock_acquire(req_L);
   request_create(req);
   lock_release(req_L);
   if (trylock(net_L)) {
      combine();
      network_isend(...);
      lock_release(net_L);
   } else {
      descr_create(ISEND,...,&d);
      post(d);
}
MPI_Wait (...,*req) {
   while (!completed(req))
    {
       lock_acquire(net_L);
       combine();
       network_progress();
       lock_release(net_L);
       /*pause/yield*/
    }
```

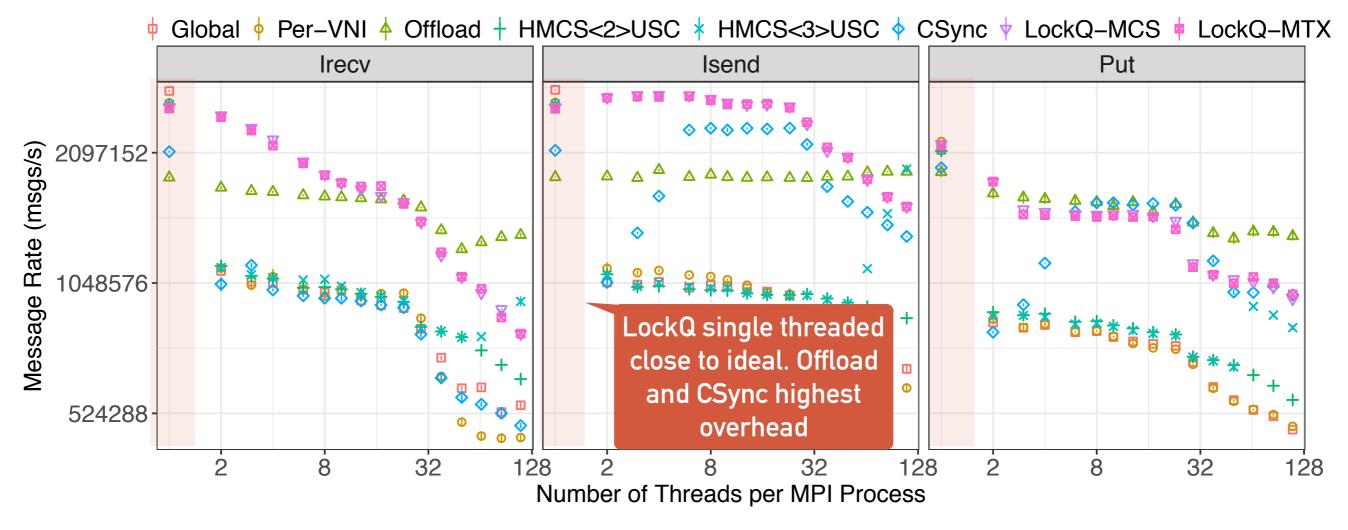
EVALUATION

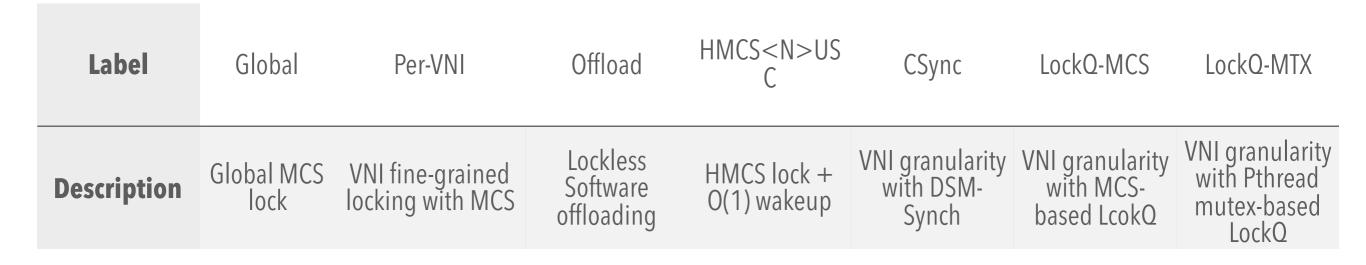
.

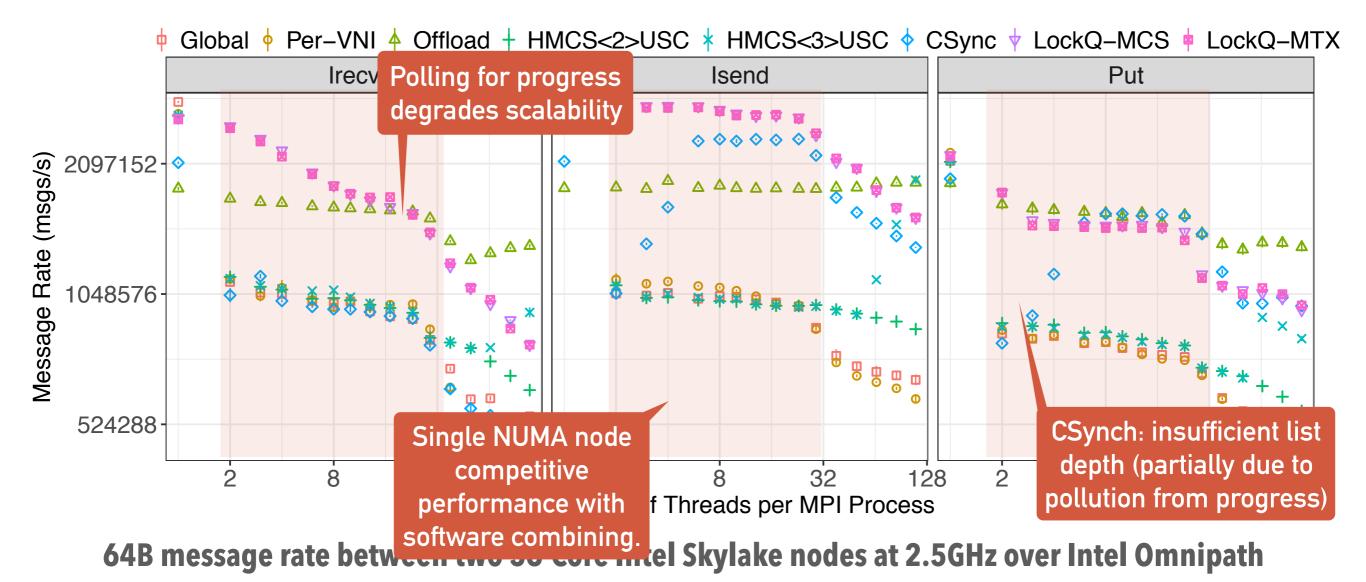


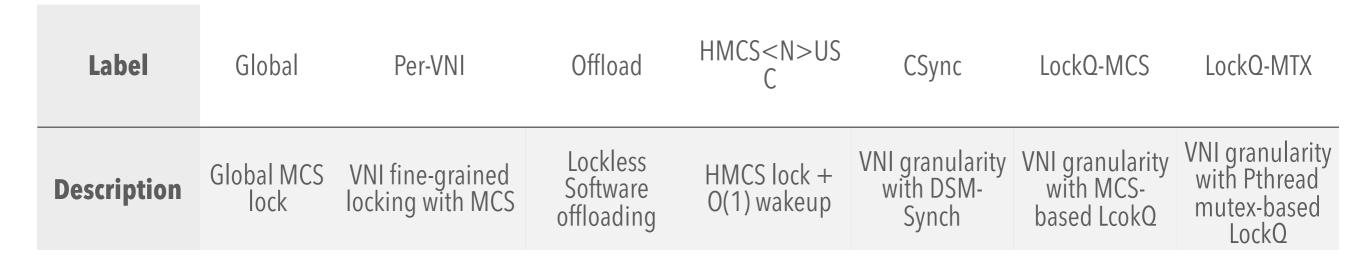


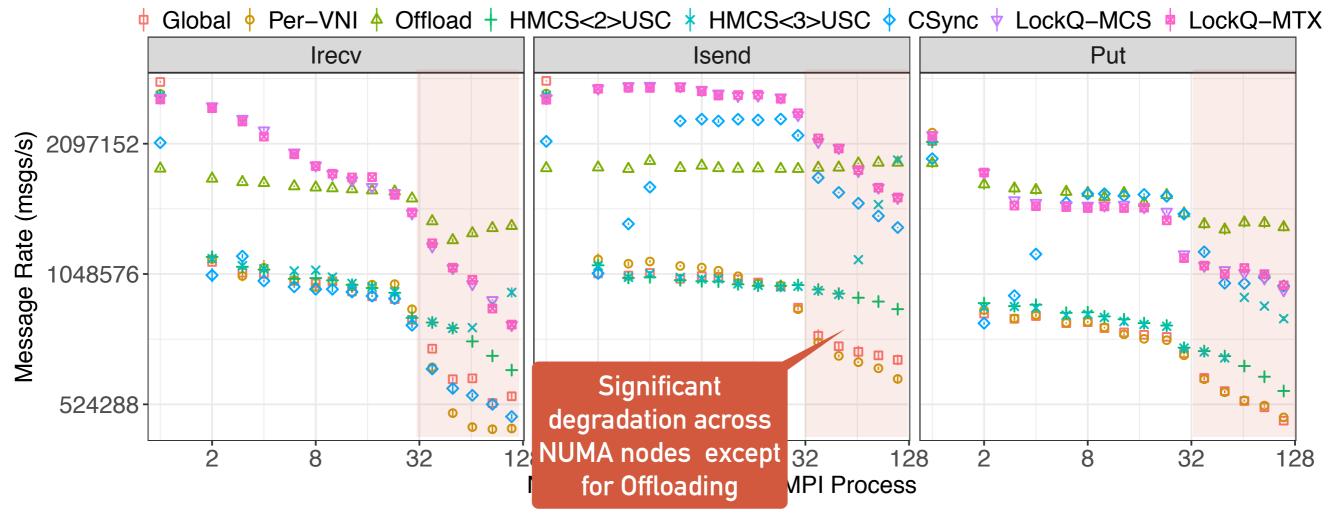


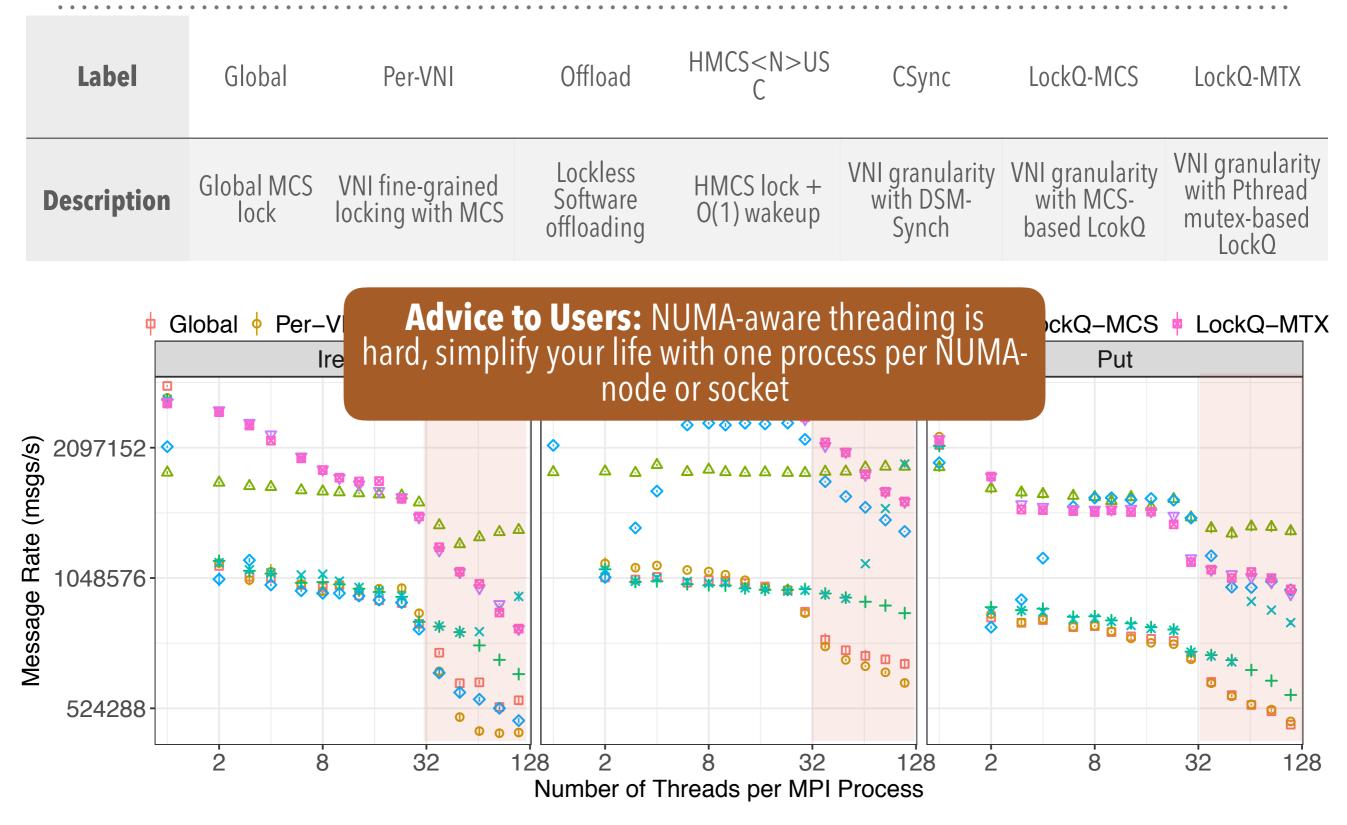




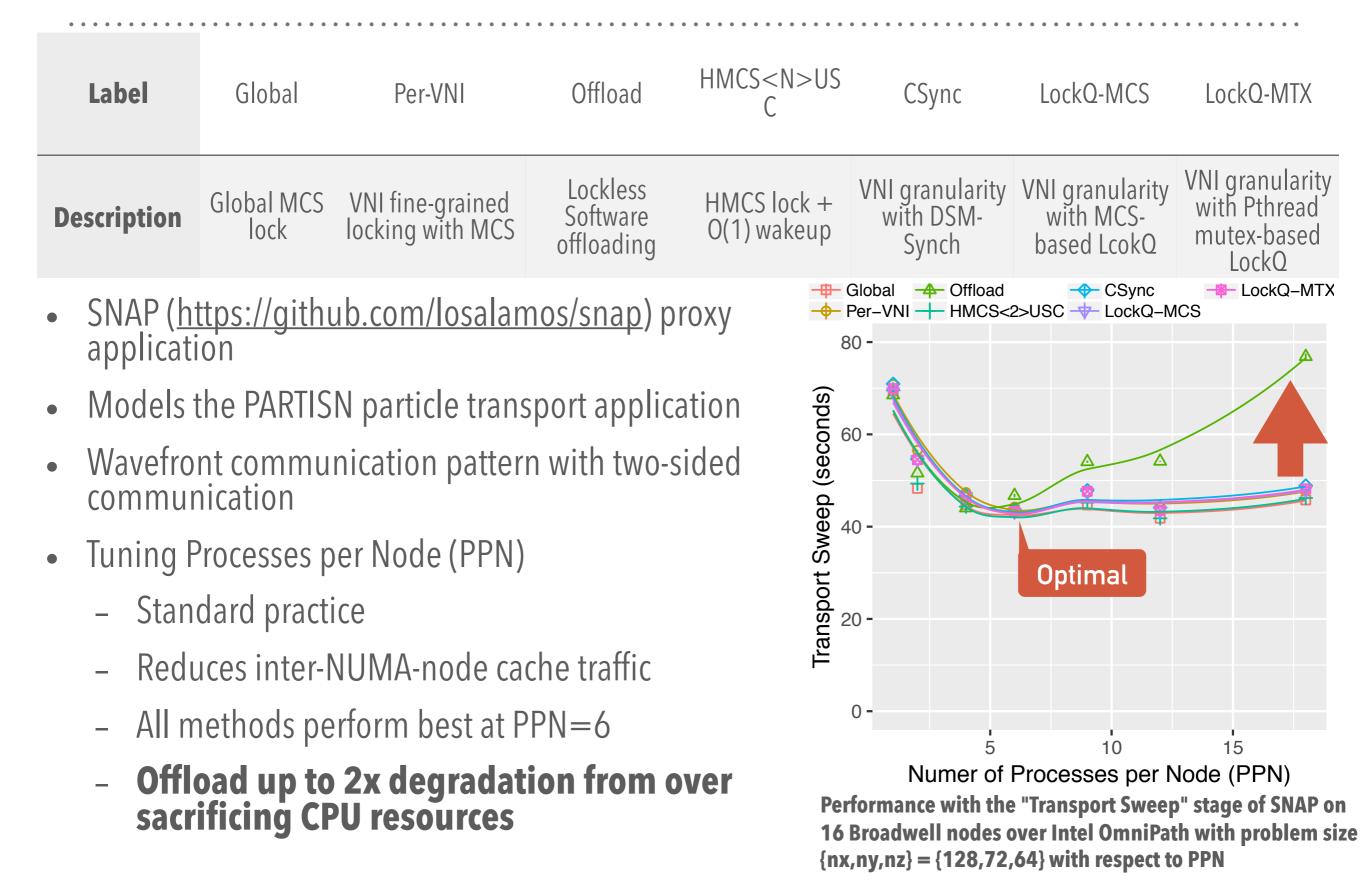




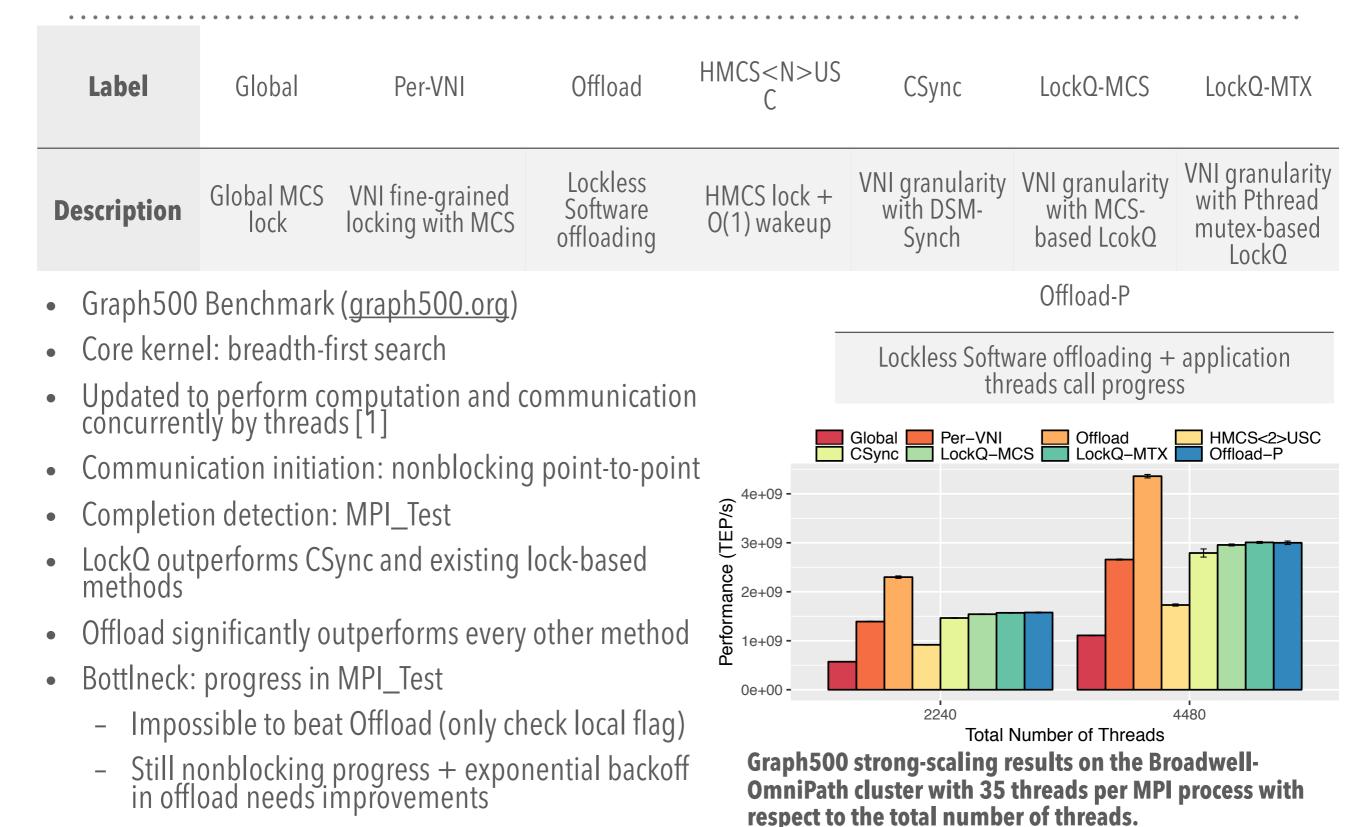




CPU SACRIFICES TEST WITH THE SNAP PROXY-APP



WORST-CASE CONTENTION WITH GRAPH500



Amer et al. "Characterizing MPI and hybrid MPI+ Threads applications at scale: case study with BFS." CCGrid'15

SUMMARY

- LockQ takes advantage of software combining for scalability
- Leverages MPI semantics to relax synchronization
- Results
 - High throughput without hardwire knowledge
 - Asynchronous nonblocking calls for latency hiding and communication overlapping
- LockQ already released in MPICH 3.3 (if you want to try it out)
- Nonblocking progress management insufficient
 - Make MPI_Test family of calls scale is still an open problem
- Evaluation with multiple VNIs for further insight

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