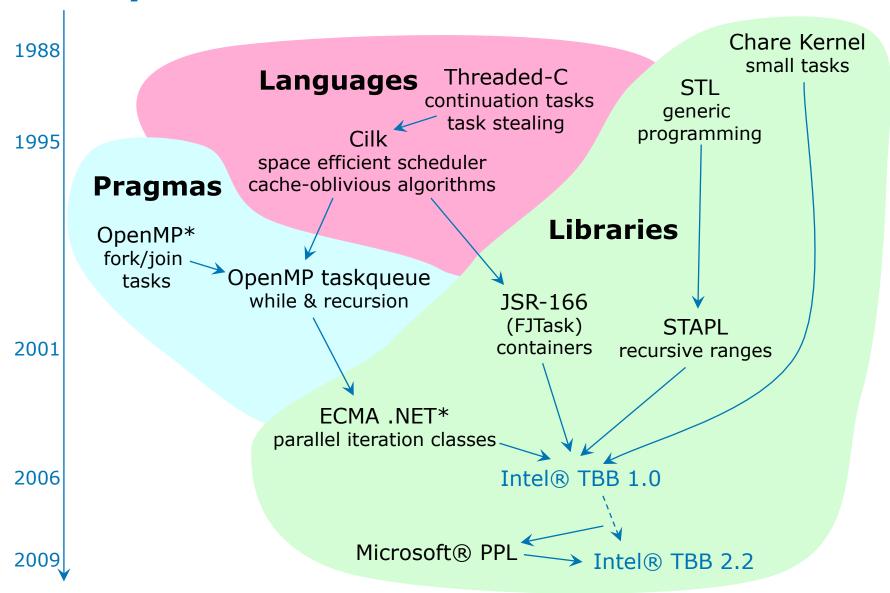


### Intel® Threading Building Blocks

Michael Wrinn, Intel

ParLab Boot Camp • August 19, 2009

#### **Family Tree**

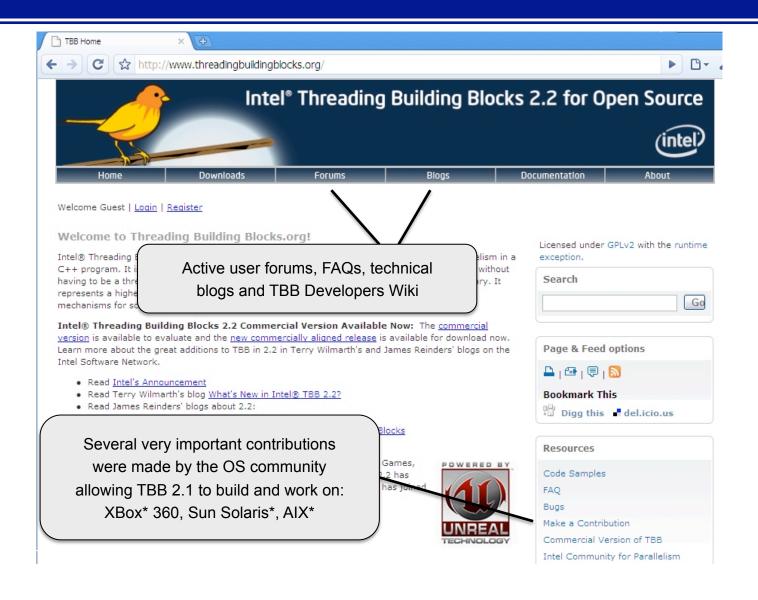


<sup>\*</sup>Other names and brands may be claimed as the property of others

# Key Features Intel® Threading Building Blocks (TBB)

- It is a template library intended to ease parallel programming for C++ developers
  - Relies on generic programming to deliver high performance parallel algorithms with broad applicability
- It provides a high-level abstraction for parallelism
  - Shifts focus from workers (threads) to the work (you specify tasks patterns instead of threads
  - Hides low level details of thread management (maps your logical tasks onto physical threads)
  - Library maps your logical tasks onto physical threads, efficiently using cache and balancing load
  - Full support for nested parallelism
- It facilitates scalable performance
  - Strives for efficient use of cache, and balances load
  - Portable across Linux\*, Mac OS\*, Windows\*, and Solaris\*
  - Emphasizes scalable data parallel programming bLoop parallelism tasks are more scalable than a fixed number of separate tasks
- Can be used in concert with other packages such as native threads and OpenMP
- Open source and licensed versions available

#### Check Intel® TBB online



#### Limitations

- TBB is not intended for
  - I/O bound processing
  - Real-time processing
- General limitations
  - Direct use only from C++
  - Distributed memory not supported (target is desktop)
  - Requires more work than sprinkling in pragmas

#### Generic Parallel Algorithms

parallel\_for, parallel\_for\_each
 parallel\_reduce
 parallel\_scan
 parallel\_do
 pipeline
 parallel\_sort
 parallel\_invoke

#### Task scheduler

task\_group task task\_scheduler\_init task\_scheduler\_observer

#### Synchronization Primitives

atomic, mutex, recursive\_mutex
spin\_mutex, spin\_rw\_mutex
queuing\_mutex, queuing\_rw\_mutex
null\_mutex, null\_rw\_mutex

Threads tbb\_thread

# Intel® TBB 2.2 Components

**Concurrent Containers** 

concurrent\_hash\_map concurrent\_queue concurrent\_bounded\_queue concurrent\_vector

#### Thread Local Storage

combinable enumerable\_thread\_specific

Memory Allocation

tbb\_allocator
zero\_allocator

cache\_aligned\_allocator scalable allocator

#### **Task-based Programming**

- Tasks are light-weight entities at user-level
  - TBB parallel algorithms map tasks onto threads automatically
  - Task scheduler manages the thread pool
    - Scheduler is unfair to favor tasks that have been most recent in the cache
  - Oversubscription and undersubscription of core resources is prevented by task-stealing technique of TBB scheduler

#### **Generic Programming**

- Best known example is C++ STL
- Enables distribution of broadly-useful high-quality algorithms and data structures
- Write best possible algorithm with fewest constraints
  - Do not force particular data structure on user
  - Classic example: STL std::sort
- Instantiate algorithm to specific situation
  - C++ template instantiation, partial specialization, and inlining make resulting code efficient
- Standard Template Library, overall, is not thread-safe

## **Generic Programming - Example**

The compiler creates the needed versions

T must define a copy constructor and a destructor

```
template <typename T> T max (T x, T y) {
   if (x < y) return y;
   return x)
}

T must define operator<
int main() {
   int i = max(20,5);
   double f = max(2.5, 5.2);
   MyClass m = max(MyClass("foo"), MyClass("bar"));
   return 0;
}</pre>
```

#### **TBB Parallel Algorithms**

- Task scheduler powers high level parallel patterns that are pre-packaged, tested, and tuned for scalability
  - parallel\_for: load-balanced parallel execution of loop iterations where iterations are independent
  - parallel\_reduce: load-balanced parallel execution of independent loop iterations that perform reduction (e.g. summation of array elements)
  - parallel\_do: load-balanced parallel execution of independent loop iterations with unknown or dynamically changing bounds (e.g. applying function to the element of linked list)
  - parallel\_scan: template function that computes parallel prefix
  - pipeline: data-flow pipeline pattern
  - parallel\_sort: parallel sort
  - parallel\_invoke: evaluates up to 10 functions, possibly in parallel and waits for all of them to finish.

#### The parallel\_for Template

template <typename Range, typename Body> void parallel\_for(const Range& range, const Body &body);

- Requires definition of:
  - A range type to iterate over
    - Must define a copy constructor and a destructor
    - Defines is\_empty()
    - Defines is\_divisible()
    - Defines a splitting constructor, R(R &r, split)
  - A body type that operates on the range (or a subrange)
    - Must define a copy constructor and a destructor
    - Defines operator()

### **Body is Generic**

Requirements for parallel\_for Body

Body::Body(const Body&) Copy constructor

Body::~Body() Destructor

void Body::operator() (Range& subrange) const

Apply the body to

subrange.

- parallel\_for partitions original range into subranges, and deals out subranges to worker threads in a way that:
  - Balances load
  - Uses cache efficiently
  - Scales

#### Range is Generic

Requirements for parallel\_for Range

```
R::R (const R&)

Copy constructor

Destructor

bool R::is_empty() const

bool R::is_divisible() const

True if range is empty

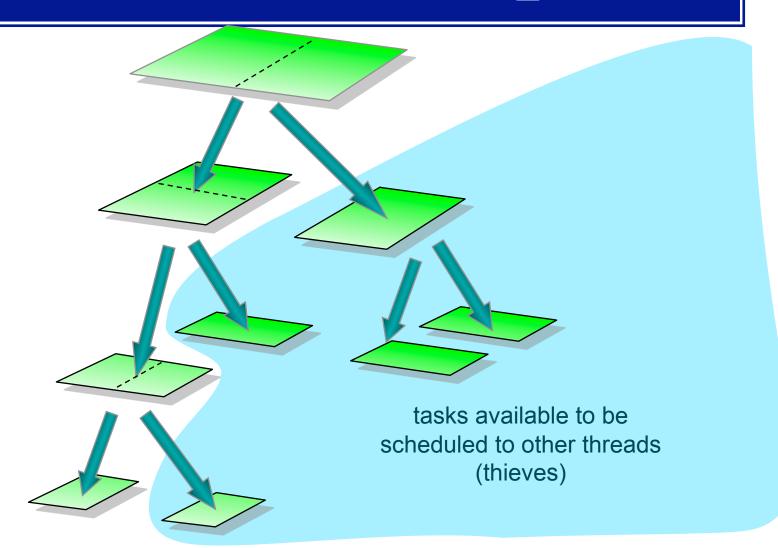
True if range can be partitioned

R::R (R& r, split)

Splitting constructor; splits r into two subranges
```

- Library provides predefined ranges
  - blocked\_range and blocked\_range2d
- You can define your own ranges

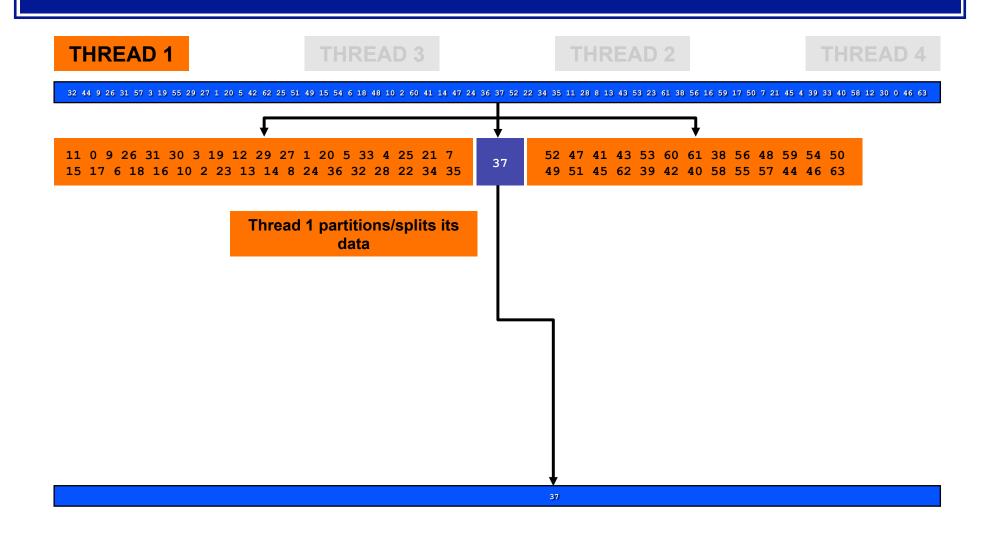
# How splitting works on blocked\_range2d

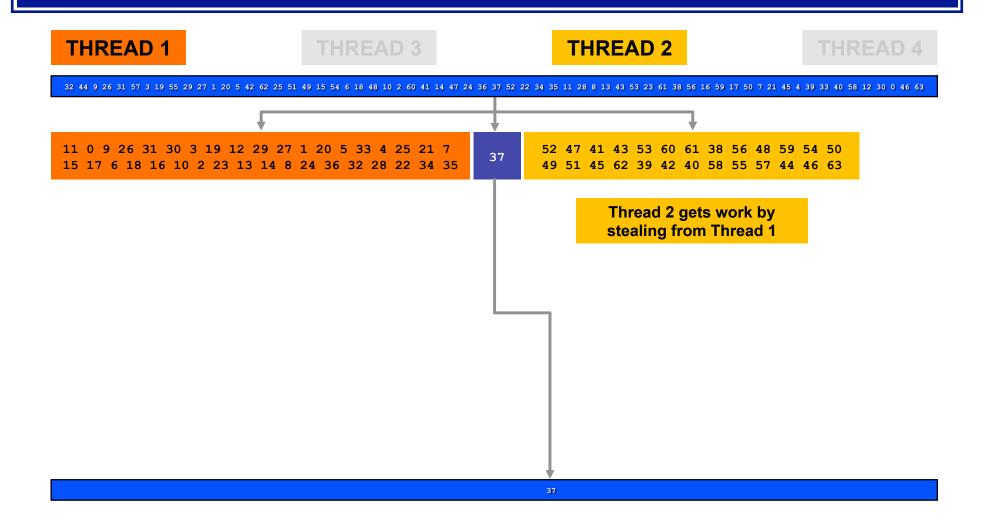


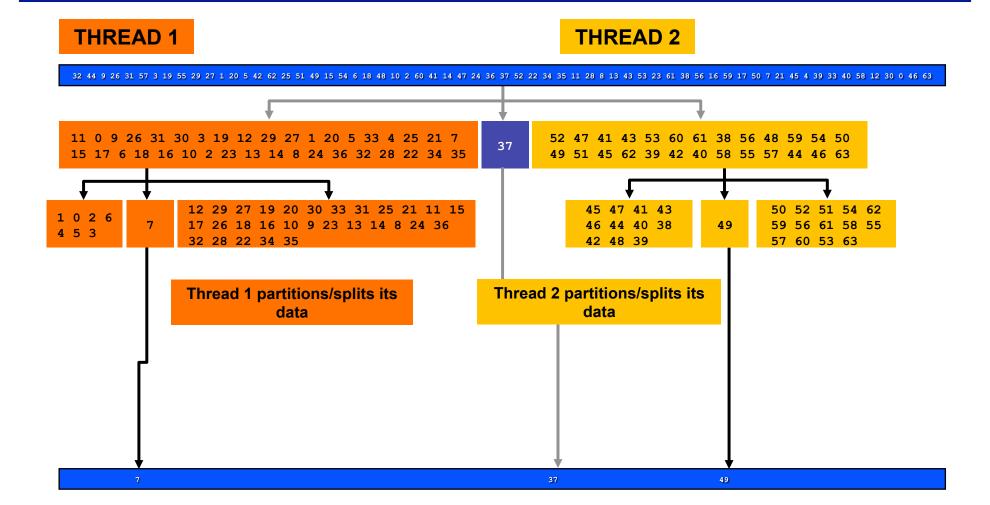
#### **THREAD 1**

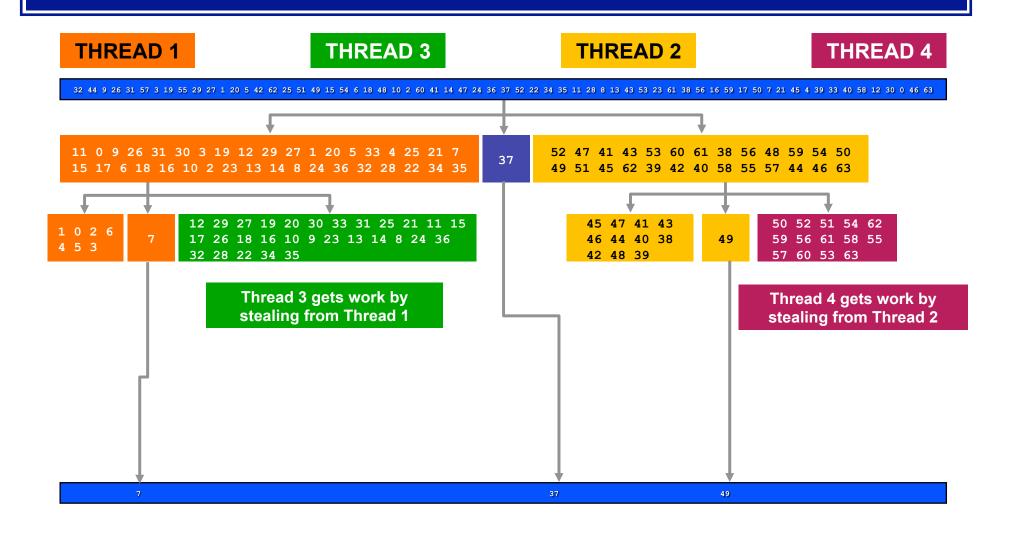
32 44 9 26 31 57 3 19 55 29 27 1 20 5 42 62 25 51 49 15 54 6 18 48 10 2 60 41 14 47 24 36 37 52 22 34 35 11 28 8 13 43 53 23 61 38 56 16 59 17 50 7 21 45 4 39 33 40 58 12 30 0 46 63

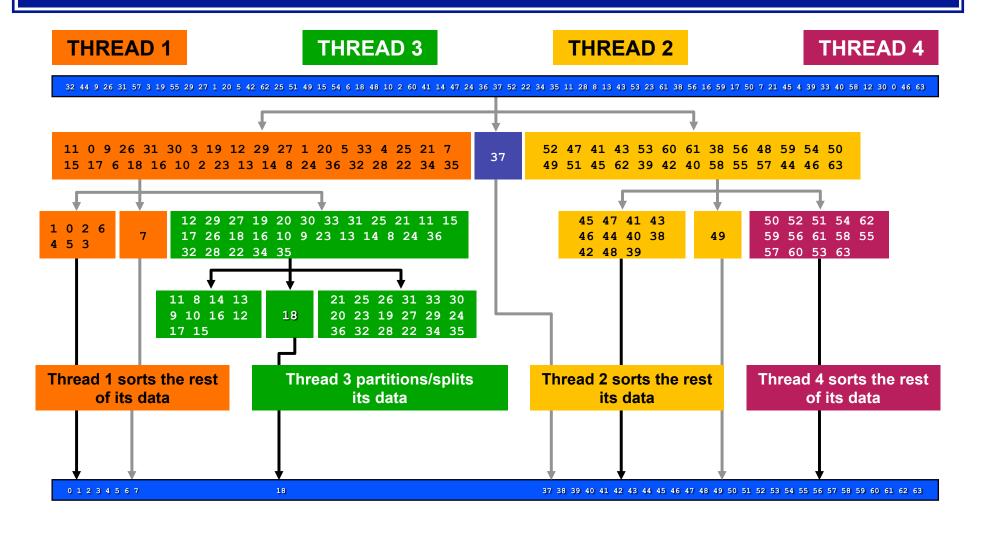
Thread 1 starts with the initial data

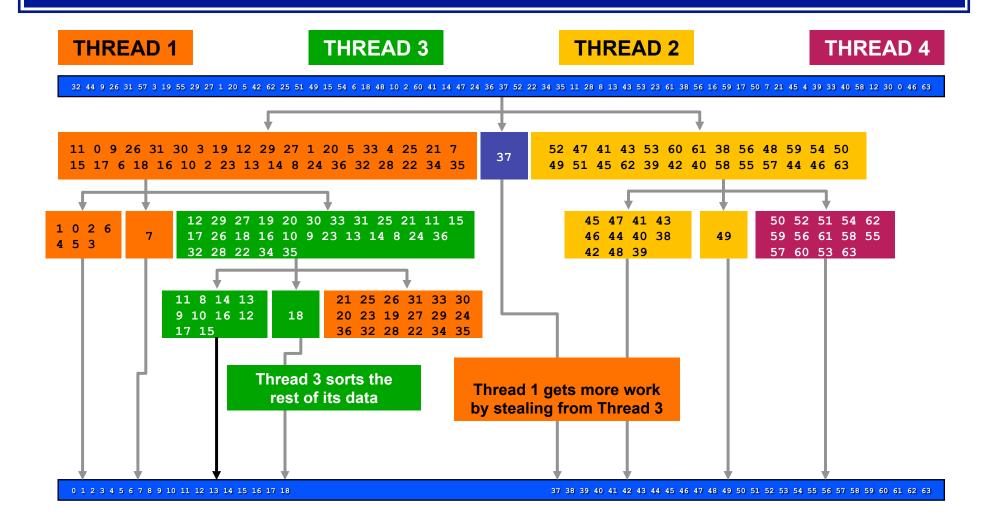


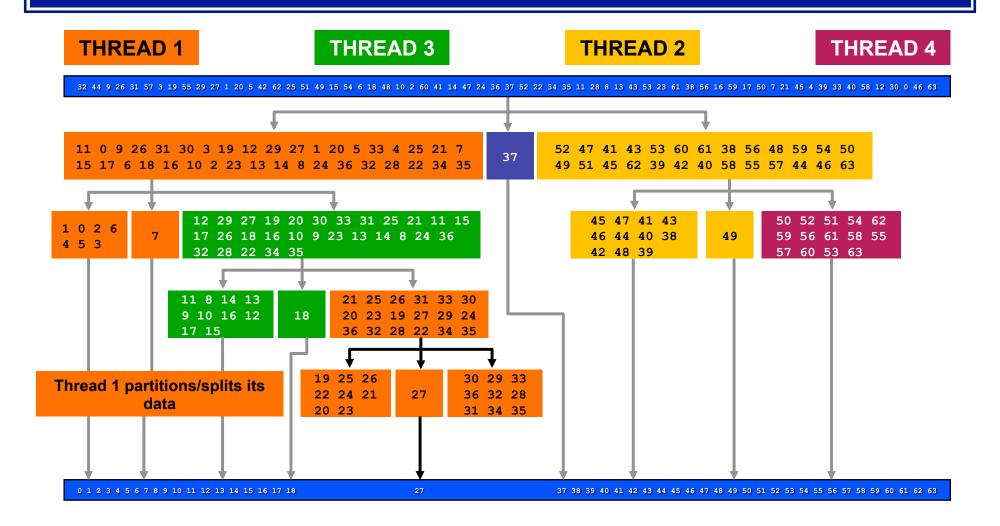


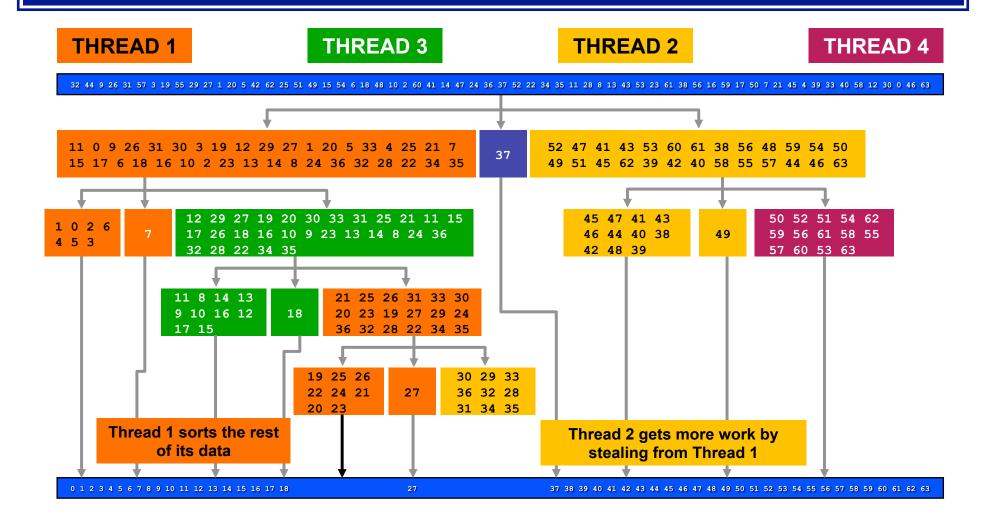


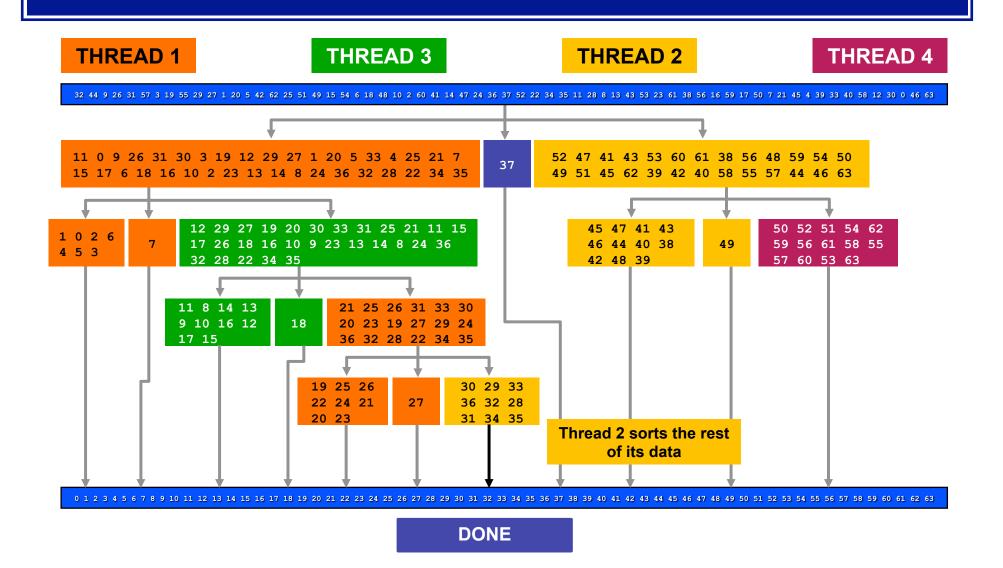












## An Example using parallel\_for (1 of 3)

Independent iterations and fixed/known bounds

```
const int N = 100000;

void change_array(float array, int M) {
    for (int i = 0; i < M; i++) {
        array[i] *= 2;
    }
}

int main () {
    float A[N];
    initialize_array(A);
    change_array(A, N);
    return 0;
}</pre>
```

## An Example using parallel\_for (2 of 3)

Include and initialize the library

```
Include Library Headers
#intchude {tbb/task scheduler init.h/
#incfidet holocked range.h"
#includeiatbbeparadyeA) for . h"
    change array(A, N);
usingenamespace tbb;
int main () {
                                      Use namespace
    task scheduler init init;
    float A[N]; \(\mathbb{N}\)
     <u>initialize array(A):</u>
    parallel change_array(A, N);
    return 0;
                                                   blue = original code
                       Initialize scheduler
                                                   green = provided by TBB
                                                   red = boilerplate for library
```

## An Example using parallel\_for (3 of 3)

Use the parallel\_for algorithm

blue = original code green = provided by TBB red = boilerplate for library

## An Example using parallel\_for (3b of 3)

Use the parallel\_for algorithm

blue = original code green = provided by TBB red = boilerplate for library

# An Example using parallel\_for with C++0x lambda functions

blue = original code green = provided by TBB red = boilerplate for library

```
void parallel change array(float *array, int M) {
 parallel for (blocked range <int>(0, M),
                [=](const blocked range <int>& r ) const{
                for (int i = r.begin(); i != r.end(); i++ ){
                    array[i] *= 2;
                                                     Use lambda function to implement
                                                        MyBody::operator() inside
                                                         the call to parallel for().
                auto partitioner());
void change array(float *array, int M) {
    for (int i = 0; i < M; i++) {
         array[i] *= 2;
                                Closer resemblance to sequential code
```

#### The parallel\_reduce Template

template <typename Range, typename Body>
void parallel\_reduce (const Range& range, Body &body);

#### Requirements for parallel\_reduce Body

Body::Body( const Body&, split ) Splitting constructor

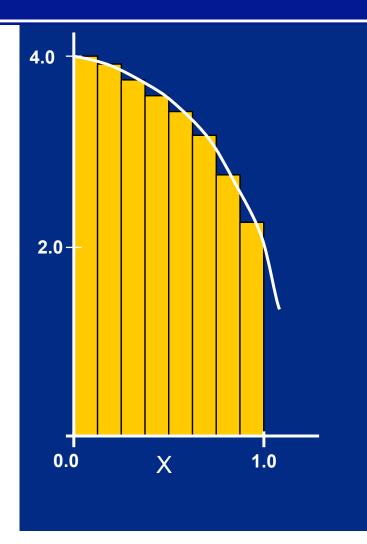
Body::~Body() Destructor

subrange

void Body::join( Body& rhs ); Merge result of rhs into

the result of this.

#### **Numerical Integration Example**



```
static long num steps=100000;
double step, pi;
void main(int argc, char*
argv[])
   int i;
   double x, sum = 0.0;
   step = 1.0/(double) num steps;
   for (i=0; i< num steps; i++) {</pre>
      x = (i+0.5)*step;
      sum += 4.0/(1.0 + x*x);
   pi = step * sum;
  printf("Pi = %f\n",pi);
```

## parallel reduce Example

```
green = provided by TBB
#include "tbb/parallel reduce.h"
                                                red = boilerplate for library
#include "tbb/task scheduler init.h"
#include "tbb/blocked range.h"
using namespace tbb;
int main(int argc, char* argv[])
  double pi;
  double width = 1./(double) num steps;
  MyPi step((double *const)&width);
  task scheduler init init;
  parallel reduce(blocked range<size t>(0,num steps), step,
                                                     auto partitioner() );
 pi = step.sum*width;
  printf("The value of PI is %15.12f\n",pi);
  return 0;
```

blue = original code

## parallel reduce Example

```
blue = original code
                                                 green = provided by TBB
class MyPi {
                                                 red = boilerplate for library
  double *const my step;
public:
  double sum;
  void operator()( const blocked range<size t>& r ) {
    double step = *my step;
    double x;
    for (size t i=r.begin(); i!=r.end(); ++i)
                                                       accumulate results
       x = (i + .5) *step;
       sum += 4.0/(1.+ x*x);
  MyPi( MyPi& x, split ) : my step(x.my step), sum(0) {}
                                                                    join
  void join( const MyPi& y ) {sum += y.sum;}
  MyPi(double *const step) : my step(step), sum(0) {}
};
```

#### **Scalable Memory Allocators**

- Serial memory allocation can easily become a bottleneck in multithreaded applications
  - Threads require mutual exclusion into shared heap
- False sharing threads accessing the same cache line
  - Even accessing distinct locations, cache line can ping-pong
- Intel® Threading Building Blocks offers two choices for scalable memory allocation
  - Similar to the STL template class std::allocator
  - scalable allocator
    - Offers scalability, but not protection from false sharing
    - Memory is returned to each thread from a separate pool
  - cache aligned allocator
    - Offers both scalability and false sharing protection

#### **Concurrent Containers**

- TBB Library provides highly concurrent containers
  - STL containers are not concurrency-friendly: attempt to modify them concurrently can corrupt container
  - Standard practice is to wrap a lock around STL containers
    - Turns container into serial bottleneck
- Library provides fine-grained locking or lockless implementations
  - Worse single-thread performance, but better scalability.
  - Can be used with the library, OpenMP, or native threads.

#### **Synchronization Primitives**

- Parallel tasks must sometimes touch shared data
  - When data updates might overlap, use mutual exclusion to avoid race
- High-level generic abstraction for HW atomic operations
  - Atomically protect update of single variable
- Critical regions of code are protected by scoped locks
  - The range of the lock is determined by its lifetime (scope)
  - Leaving lock scope calls the destructor, making it exception safe
  - Minimizing lock lifetime avoids possible contention
  - Several mutex behaviors are available

## **Atomic Execution**

#### atomic<T>

- T should be integral type or pointer type
- Full type-safe support for 8, 16, 32, and 64-bit integers Operations

`= x' and `x = '	read/write value of x
x.fetch_and_store (y)	z = x, $x = y$ , return $z$
x.fetch_and_add (y)	z = x, $x += y$ , return $z$
x.compare_and_swap (y,p)	z = x, if $(x==p)$ $x=y$ ; return $z$

```
atomic <int> i;
. . .
int z = i.fetch_and_add(2);
```

## **Mutex Concepts**

Mutexes are C++ objects based on scoped locking pattern

Combined with locks, provide mutual exclusion

M()	Construct unlocked mutex
~M()	Destroy unlocked mutex
typename M::scoped_lock	Corresponding scoped_lock type
M::scoped_lock ()	Construct lock w/out acquiring a mutex
M::scoped_lock (M&)	Construct lock and acquire lock on mutex
M::~scoped_lock ()	Release lock if acquired
M::scoped_lock::acquire (M&)	Acquire lock on mutex
M::scoped_lock::release ()	Release lock

### **Mutex Flavors**

- spin\_mutex
  - Non-reentrant, unfair, spins in the user space
  - VERY FAST in lightly contended situations; use if you need to protect very few instructions
- queuing\_mutex
  - Non-reentrant, fair, spins in the user space
  - Use Queuing\_Mutex when scalability and fairness are important
- queuing\_rw\_mutex
  - Non-reentrant, fair, spins in the user space
- spin\_rw\_mutex
  - Non-reentrant, fair, spins in the user space
  - Use ReaderWriterMutex to allow non-blocking read for multiple threads

## spin mutex Example

```
#include "tbb/spin mutex.h"
Node* FreeList;
typedef spin mutex FreeListMutexType;
FreelistMutexType FreelistMutex;
Node* AllocateNode () {
  Node* n;
    FreelistMutexType::scoped lock mylock(FreeListMutex);
    n = FreeList;
    if ( n ) FreeList = n->next;
  if (!n) n = new Node();
  return n;
void FreeNode( Node* n ) {
  FreelistMutexType::scoped lock mylock(FreeListMutex);
  n->next = FreeList;
  FreeList = n;
```

blue = original code green = provided by TBB red = boilerplate for library

## One last question...

#### How do I know how many threads are available?

- Do not ask!
  - Not even the scheduler knows how many threads really are available
    - There may be other processes running on the machine
  - Routine may be nested inside other parallel routines
- Focus on dividing your program into tasks of sufficient size
  - Task should be big enough to amortize scheduler overhead
  - Choose decompositions with good depth-first cache locality and potential breadth-first parallelism
- Let the scheduler do the mapping





# Lithe: Enabling Efficient Composition of Parallel Libraries

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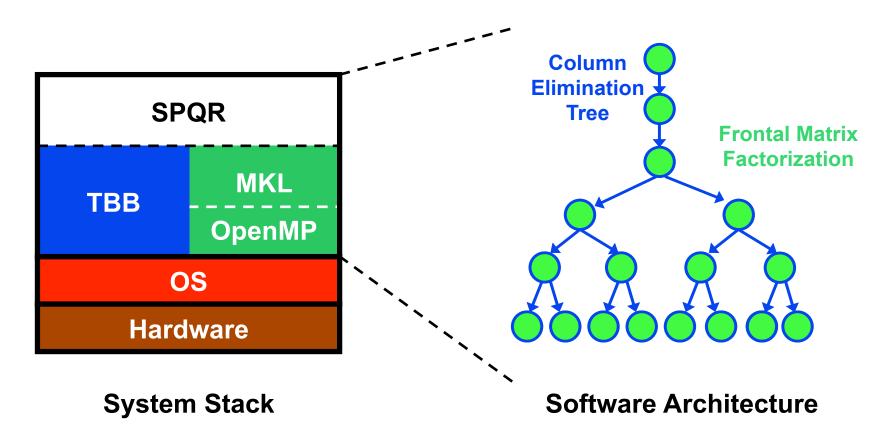
Massachusetts Institute of Technology • UC Berkeley

ParLab Boot Camp • August 19, 2009

## Real-World Parallel Composition Example

#### **Sparse QR Factorization**

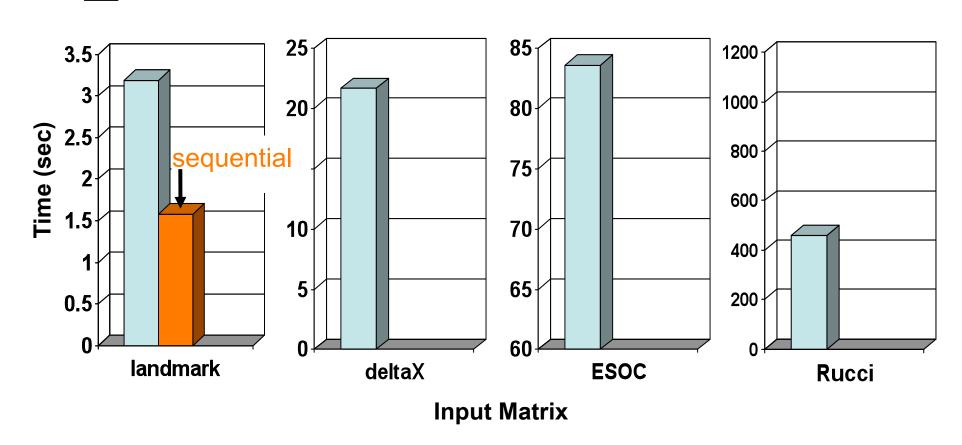
(Tim Davis, Univ of Florida)



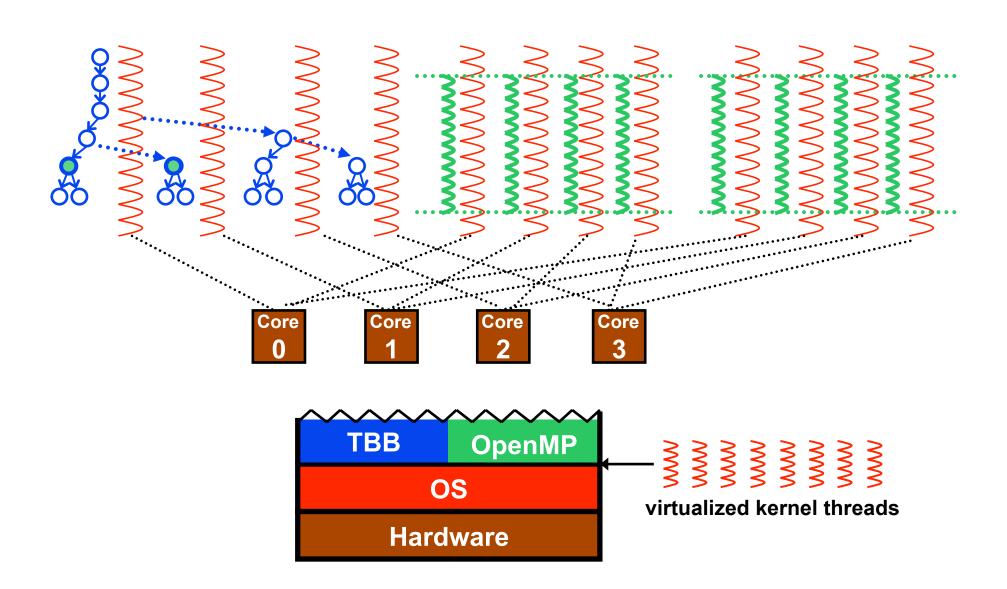
## **Out-of-the-Box Performance**

#### Performance of SPQR on 16-core Machine

Out-of-the-Box



# Out-of-the-Box Libraries Oversubscribe the Resources



### **MKL Quick Fix**

#### **Using Intel MKL with Threaded Applications**

http://www.intel.com/support/performancetools/libraries/mkl/sb/CS-017177.htm

#### Software Products

Intel® Math Kernel Library (Intel® MKL)
Using Intel® MKL with Threaded Applications

#### Page Contents:

- Memory Allocation MKL: Memory appears to be allocated and not released when calling some Intel MKL routines (e.g. sgetrf).
- Using Threading with BLAS and LAPACK
- Setting the Number
- Changing the Num
   Can Luse Intel M

Memory Allocation MKW N some Intel® MKL routines One of the advantages if us OpenMP\*. OpenMP\* require even for single-proceeping syoccurs once the first time the allocation persists until the ay will allocate a stack equal to of memory that is automatics allocations and the number or

Using Threading with BLA Intel MKL is threaded in a nu Level 3 BLAS, DFTs, and Ff situations with conflicts We list them here with reconthe the problem exists is approp library with Intel MKL. In this case, the safe approach is to set OMP\_NUM\_THREADS=1.

- Multiple programs are running on a multiple-CPU system. In cluster applications, the parallel program can run separate instances of the program on each processor. However, the threading software will see multiple processors on the system even though each processor has a separate process running on it. In this case OMP\_NUM\_THREADS should be set to 1.
- If the variable OMP\_NUM\_THREADS environment variable is not set, then
  the default number of threads will be assumed 1.

Setting the Number of Threads for OpenMP\* (OMP)

printf("rowltalto!n");
for ( i=0]:<10]i+){
 printf("%d:\t%f\t%f\t%f\n", i, a[i\*SIZE], o[i\*SIZE]);
}
omp\_set\_num\_threads(1);
for ( i=0; !<SIZE; i++){
 for ( i=0; !<SIZE; i++){
 i[\*SIZE+]]= (double)(i+);
 b[\*SIZE+]]= (double)(i\*);
 o[i\*SIZE+]]= (double)();
}</pre>

• If more than one thread calls Intel MKL and the function being called is threaded, it is important that threading in Intel MKL be turned off.

Set OMP NUM THREADS=1 in the environment.

If the user Inreads the program using OpenMP directives and uses the Intel® Compilers to compile the program. Intel MKL and the user program will both use the same threading library. Intel MKL these to detegrine if it is in a parallel region in the program, and if it is, it does not spread it operations over multiple threads. But Intel MKL can be aware that it is in a parallel region only if the threaded program and Intel MKL are using the same threading library. If the user program is threaded by some other means, Intel MKL may operate in multithreaded mode and the computations may be corrupted. Here are several cases and our recommendations:

 User threads the program using OS threads (pthreads on Linux\*, Win32\* threads on Windows\*). If more than one thread calls Intel MKL and the function being called is threaded, it is important that threading in Intel MKL be turned off. Set OMP\_NUM\_THREADS=1 in the environment.

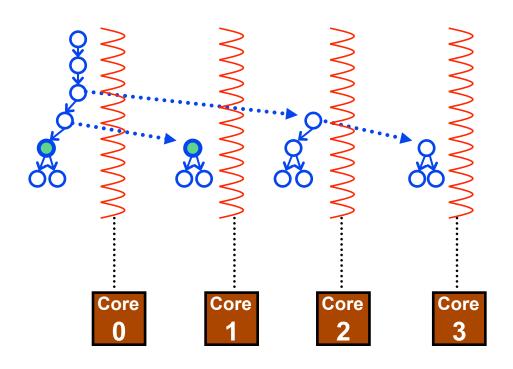
User threads the program using OpenMP directives and/or pragmas and compiles the program using a compiler other than a compiler from Intel. This is more problematic because setting OMP\_NUM\_THREADS in the environment affects both the compiler's threading library and the threading

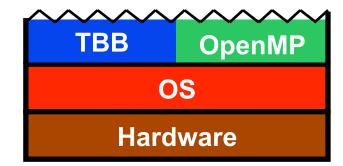
```
printf("row/ta/to/n");
for ( i=0;i<10;i++){
    printf("%d:++){
    printf("%d:+%fit%fin", i, a[i*SIZE],
    c[i*SIZE]);
    }
    delete [] a;
    delete [] b;
    delete [] c;
}
```

#### Can I use Intel MKL if I thread my application?

The Intel Math Kernel Library is designed and compiled for thread safety so it can be called from programs that are threaded. Calling Intel MKL routines that are threaded from multiple application threads can lead to conflict (including incorrect answers or program failures), if the calling library differs from the Intel MKL threading library.

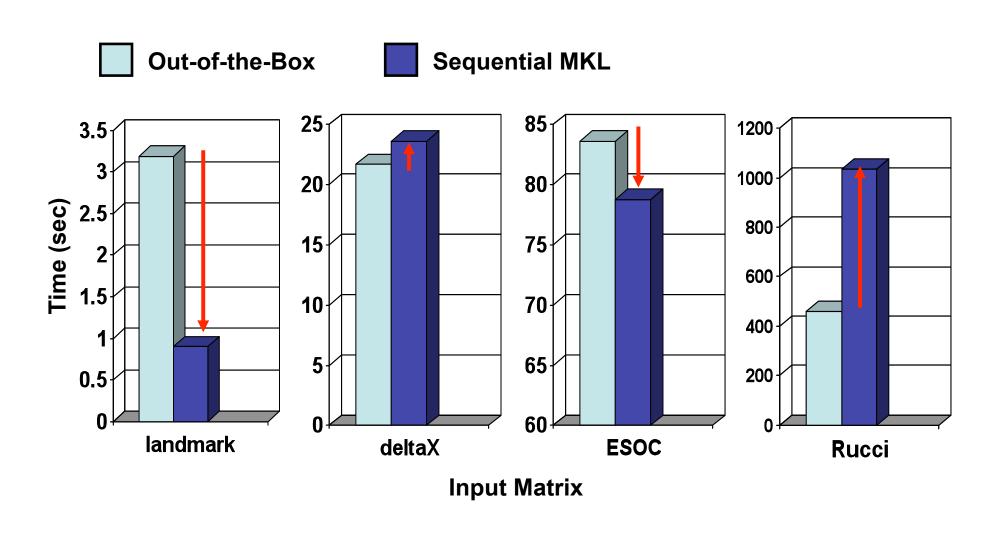
## Sequential MKL in SPQR



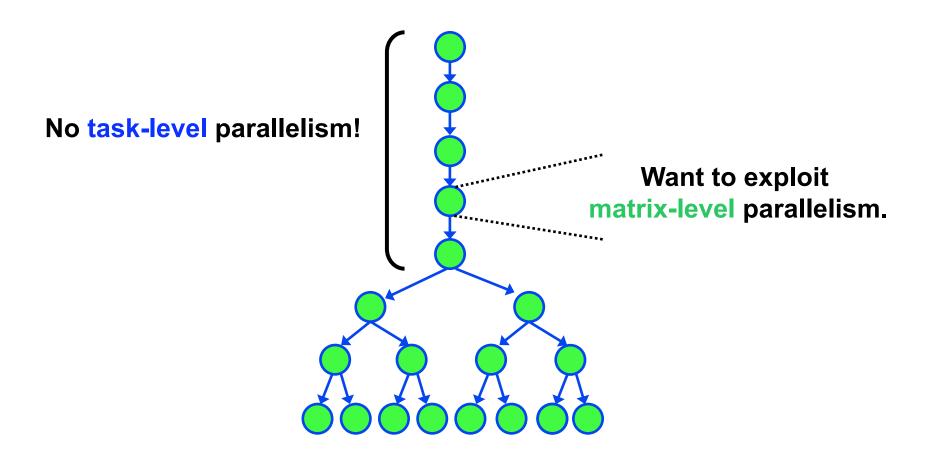


## **Sequential MKL Performance**

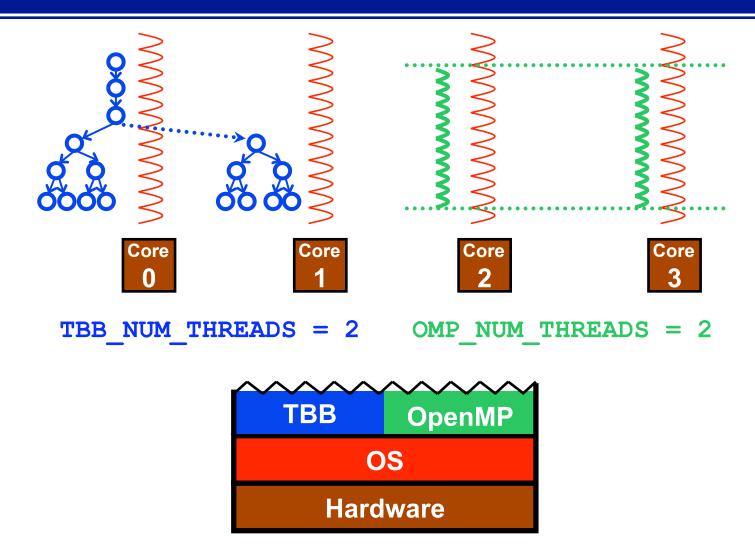
#### Performance of SPQR on 16-core Machine



## **SPQR Wants to Use Parallel MKL**



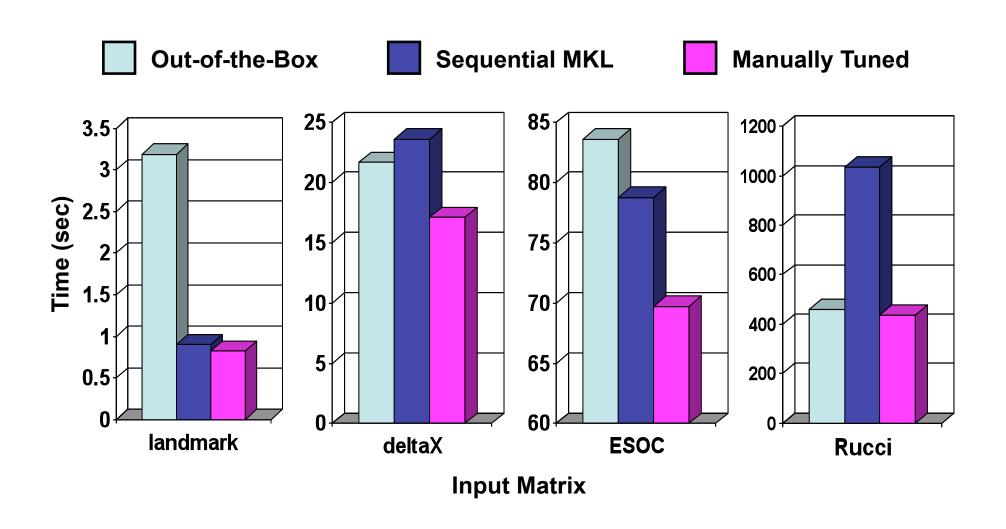
## **Share Resources Cooperatively**



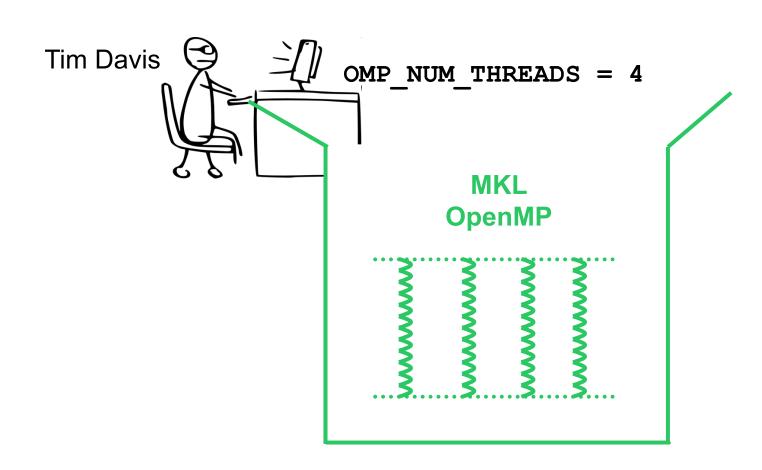
Tim Davis manually tunes libraries to effectively partition the resources.

## **Manually Tuned Performance**

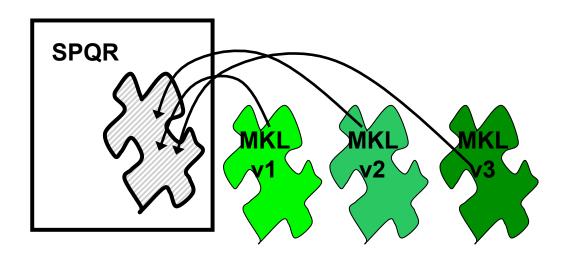
#### Performance of SPQR on 16-core Machine



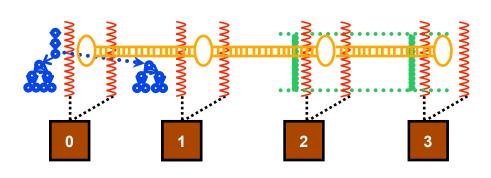
# **Manual Tuning Destroys Black Box Abstractions**



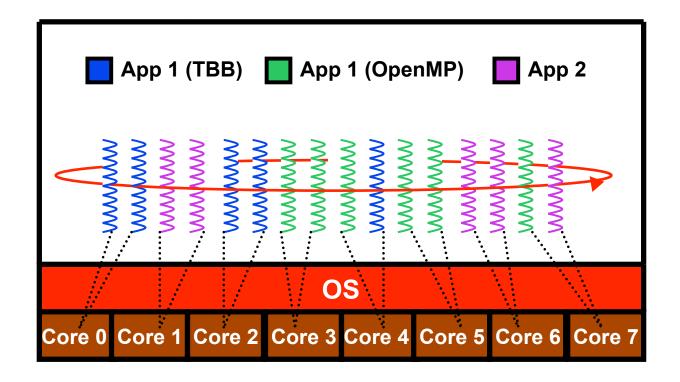
# Manual Tuning Destroys Code Reuse and Modular Updates





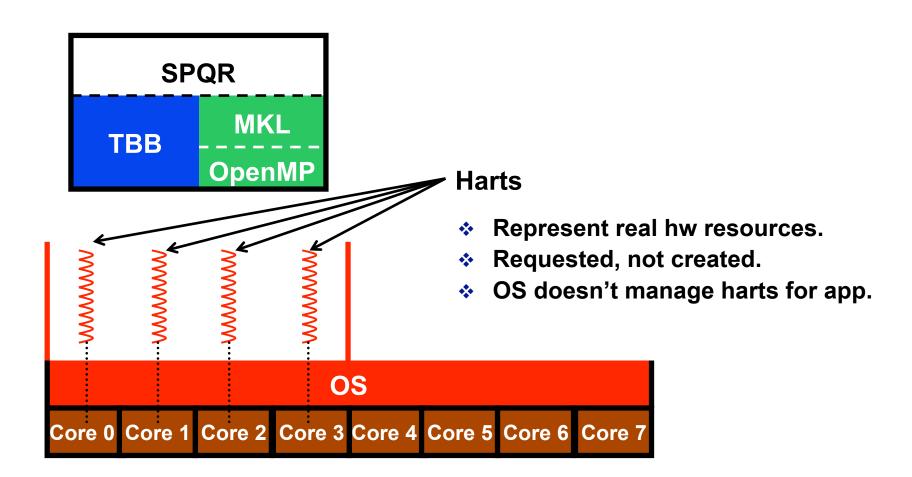


### Virtualized Threads are Bad

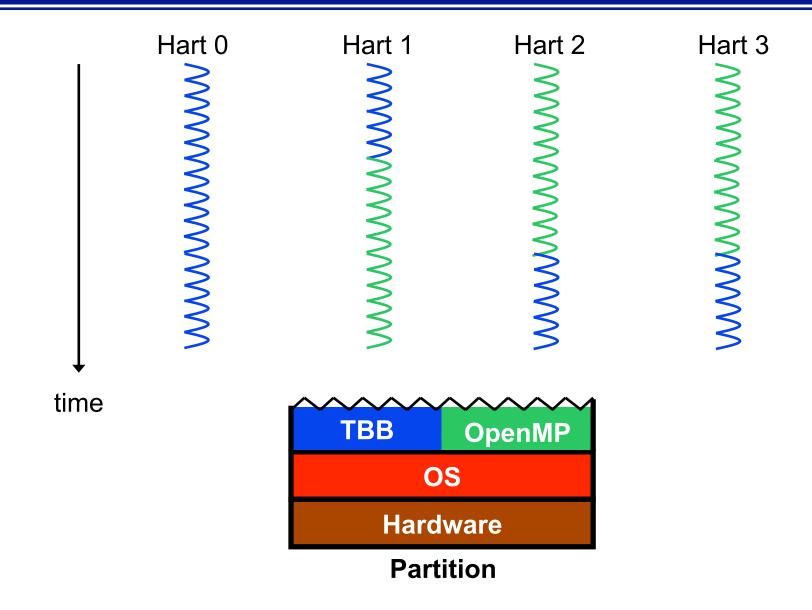


Different codes compete unproductively for resources.

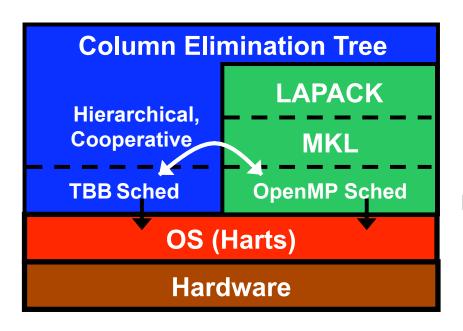
## **Harts: Hardware Thread Contexts**



## **Sharing Harts**

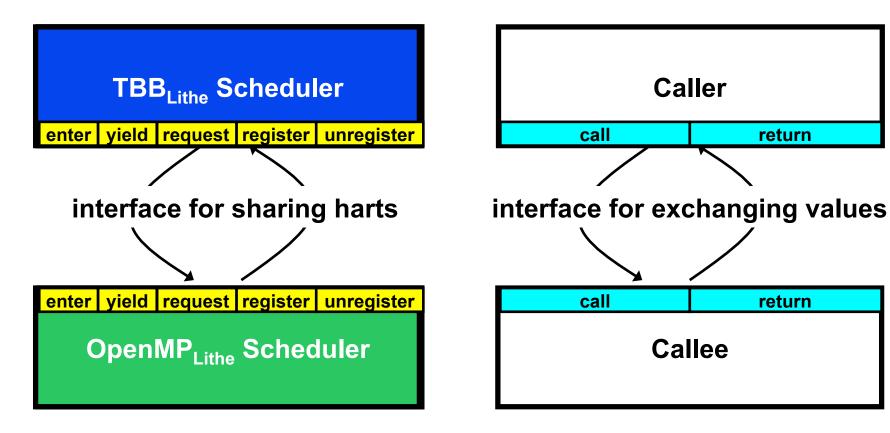


## **Hierarchical Cooperative Scheduling**



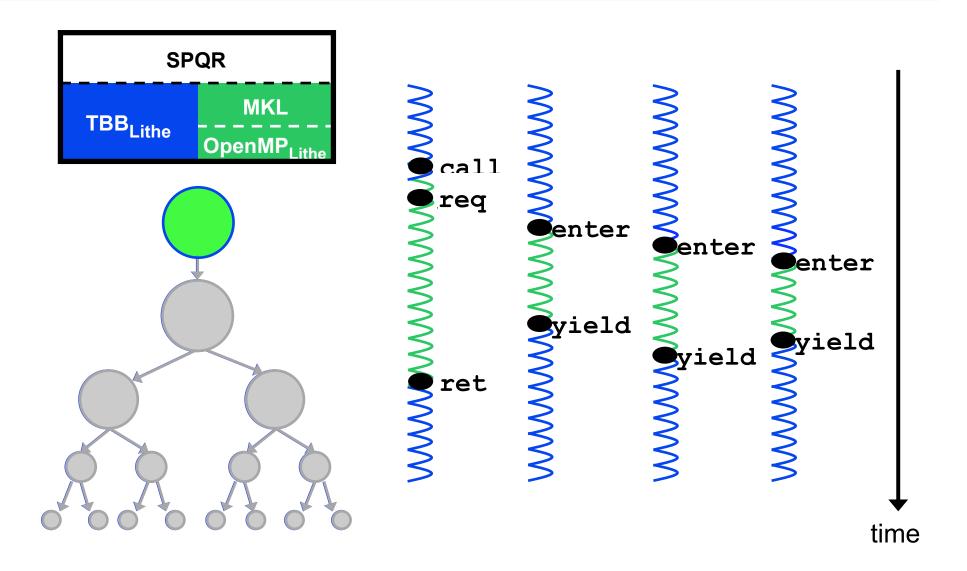
Direct Control of Resources

#### **Standard Lithe ABI**

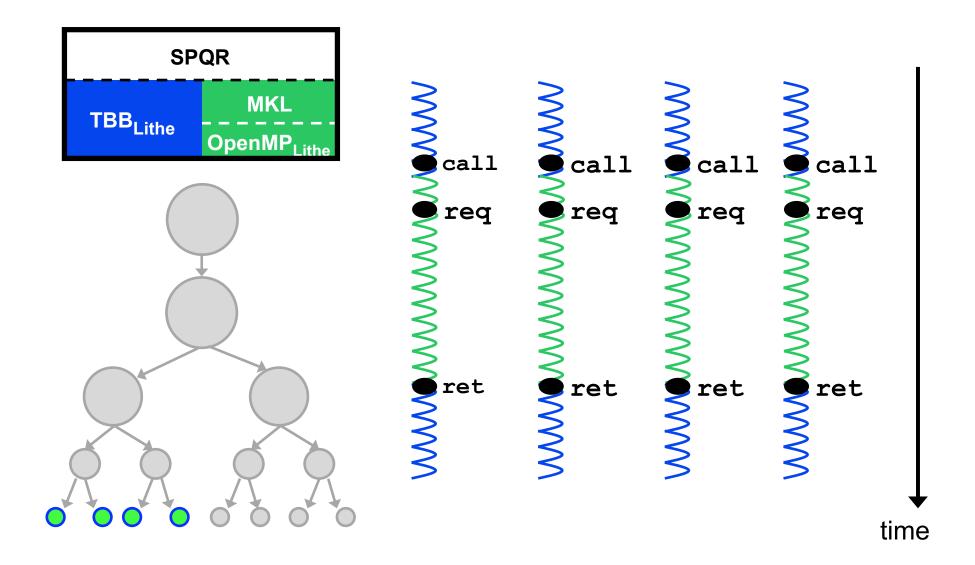


- Analogous to function call ABI for enabling interoperable codes.
- Mechanism for sharing harts, not policy.

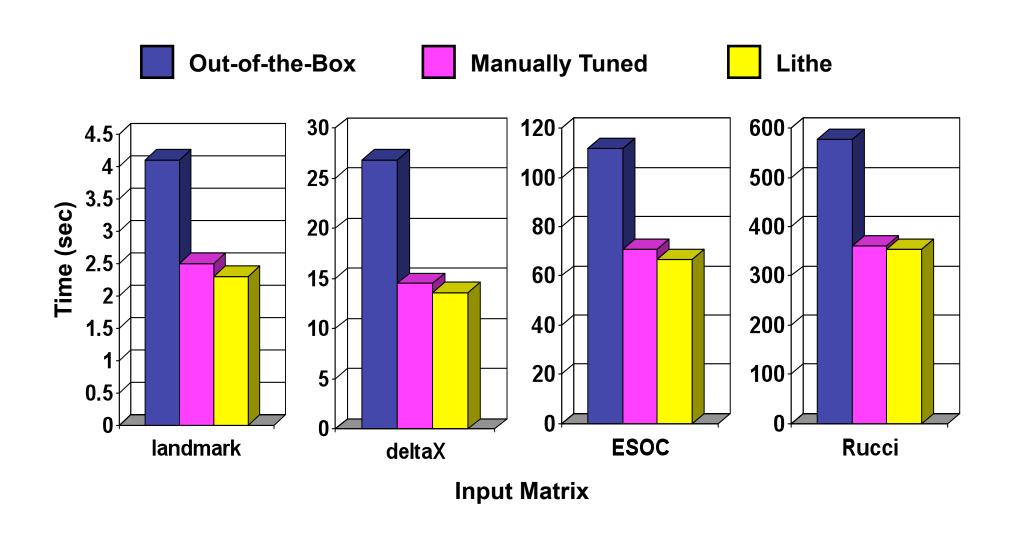
## **SPQR with Lithe**



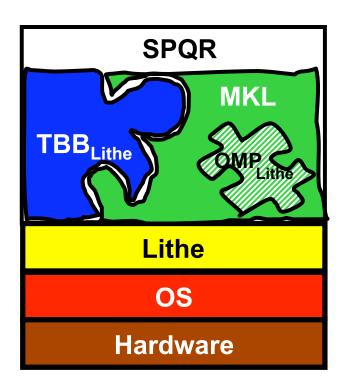
## **SPQR with Lithe**



## Performance of SPQR with Lithe



## **Questions?**



**Lithe: Enabling Efficient Composition of Parallel Libraries** 

## **Acknowledgements**

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