

Parallel Programming with Threads and Tasks

TDDD56 Lecture 2

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Outline

Lecture 1: Multicore Architecture Concepts

Architectural trends and consequences for programming

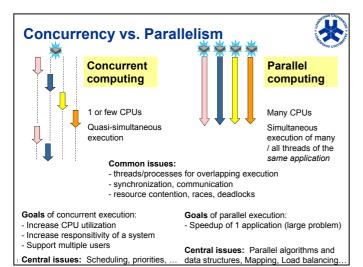
Lecture 2: Parallel programming with threads and tasks

- Revisiting processes, threads, synchronization
 - Pthreads
 - OpenMP (very shortly)
- Tasks
 - Cilk
 - Futures

Lecture 3: Shared memory architecture concepts

Lecture 4: Non-blocking synchronization

Lecture 5: Design and analysis of parallel algorithms





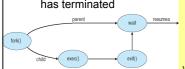
Processes

(Refresher from TDDB68)

Example: Process Creation in UNIX



- fork system call
 - creates new child process
- exec system call
 - used after a fork to replace the process' memory space with a new program
- wait system call
 - by parent, suspends parent execution until child process has terminated



int main()
{
 Pid_t ret;
 /* fork another process: */
 ret = fork();
 if (ret < 0) { /* error occurred */</pre>

(ret < 0) { /* error occurred */
 fprintf (stderr, "Fork Failed");
 exit(-1);</pre>

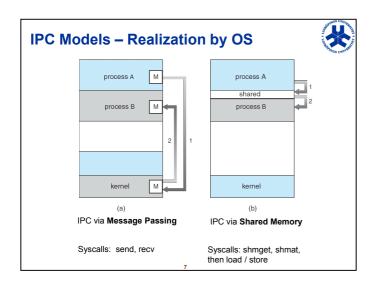
else { /*parent process: ret=childPID /* will wait for child to complete: wait (NULL); printf ("Child Complete"); exit(0);

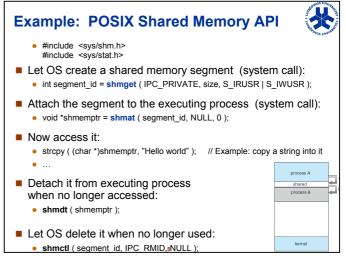
Parallel programming with processes

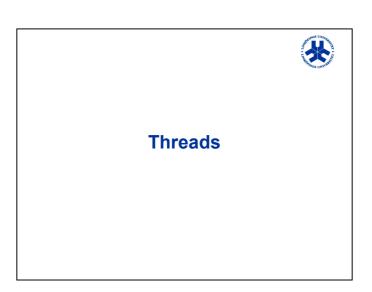


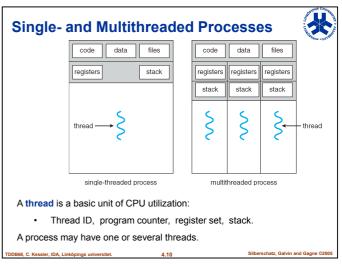
- Processes can create new processes that execute concurrently with the parent process
- OS scheduler also for single-core CPUs
- Different processes share nothing by default
 - Inter-process communication via OS only, via shared memory (write/read) or message passing (send/recv)
- Threads are a more light-weight alternative for programming shared-memory applications
 - Sharing memory (except local stack) by default
 - Lower overhead for creation and scheduling/dispatch
 - ▶ E.g. Solaris: creation 30x, switching 5x faster

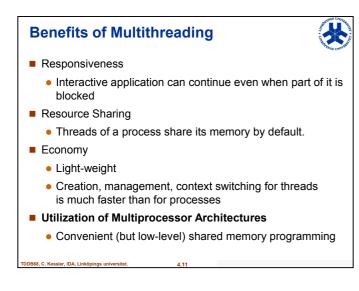
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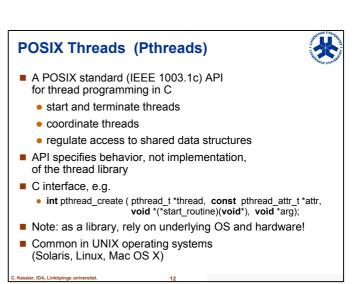












Starting a Thread (1)



Thread is started with function

int pthread_create (pthread_t *thread, const pthread_attr_t *attr, void *(*func)(void*), void *arg);

- Called func must have parameter and ret values void* Exception: first thread is started with main()
- Thread terminates when called function terminates or by pthread_exit (void *retval)
- Threads started one by one
- Threads represented by data structure of type pthread_t

Starting a Thread (2)

■ Example:

```
#include <pthread.h>
int main ( int argc, char *argv[] )
  int *ptr;
 pthread tthr;
  pthread_create( &thr,
                   (void*)ptr );
  pthread_join( &thr, NULL );
 return 0;
}
```

```
void *foo ( void *vp )
  int i = (int) vp;;
}
// alternative
// – pass a parameter block:
void *foo ( void *vp )
  Userdefinedstructtype *ptr;
  ptr=(Userdefinedstructtype*)vp;
}
```

Access to Shared Data (0)



- Globally defined variables are globally shared and visible to all threads.
- Locally defined variables are visible to the thread executing the function.

■ Example 0: Parallel incrementing

```
int a[N]; // shared, assume P | N
pthread_t thr[P];
int main( void )
```

for (t=0; t<P; t++) pthread_create(&(thr[t]), NULL incr, a + t*N/P); for (t=0; t<P; t++) pthread_join(thr[t], NULL);

void *incr (void *myptr_a) for (i=0; i<N/P; i++)

((int*)myptr_a[i])++

Access to Shared Data (1)



- Globally defined variables are globally shared and visible to all threads.
- Locally defined variables are visible to the thread executing the function.
- But all data in shared memory publish an address of data: all threads could access...
- Take care: typically no protection between thread data thread1 (foo1) could even write to thread2's (foo2) stack frame

■ Example 1

```
int *globalptr = NULL; // shared ptr
void *foo1 ( void *ptr1 )
  int i = 15;
```

globalptr = &i; // ??? dangerous! // if foo1 terminates, foo2 writes // somewhere, unless globalptr // value is reset to NULL manually

void *foo2 (void *ptr2) if (globalptr) *globalptr = 17;

Access to Shared Data (2)



- Globally defined variables are globally shared and visible to all threads
- Locally defined variables are visible to the thread executing the function
- But all data in shared memory publish an address of data: all threads could access...
- Take care: typically no protection between thread data thread1 could even write to thread2's stack frame

■ Example 2

```
int *globalptr = NULL; // shared ptr
void *foo1 ( void *ptr1 )
  int i = 15;
  globalptr =(int*)malloc(sizeof(int));
  // safe, but possibly memory leak,
  // OK if garbage collection ok
```

```
void *foo2 ( void *ptr2 )
  if (globalptr) *globalptr = 17;
```

Coordinating Shared Access (3)



- What if several threads need to write a shared variable?
- If they simply write: ok if write order does not play a role
- If they read and write: encapsulate (critical section, monitor) and protect e.g. by mutual exclusion using mutex locks)
- Example: Access to a taskpool
 - threads maintain list of tasks to be performed
 - if thread is idle, gets a task and performs it

// each thread: while (! workdone) task = gettask(Pooldescr); performtask (task); // may be called concurrently: Tasktype gettask (Pool p) // begin critical section task = p.queue [p.index]; p.index++; // end critical section

return task;

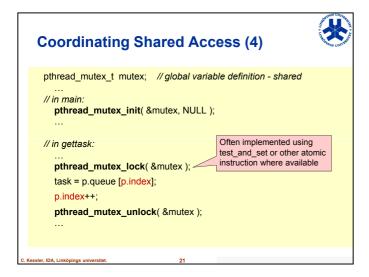
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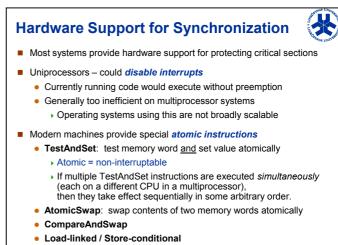
Race Conditions lead to Nondeterminism ■ Example: p.index++ could be implemented in machine code as Not 39: register1 = p.index 40: register1 = register1 + 1 41: p.index = register1 // load atomic! ■ Consider this execution interleaving, with "index = 5" initially: 39: thread1 executes register1 = p.index { T1.register1 = 5 } 39: thread2 executes register1 = p.index 40: thread1 executes register1 = register1 + 1 40: thread2 executes register1 = register1 + 1 41: thread1 executes p.index = register1 41: thread2 executes p.index = register1 T2.register1 = 5 } { T1.register1 = 5 } { T1.register1 = 6 } { T2.register1 = 6 } { p.index = 6 } { p.index = 6 } Compare to a different interleaving, e.g., 39,40,41, 39,40,41... → Result depends on relative speed of the accessing threads (race condition)

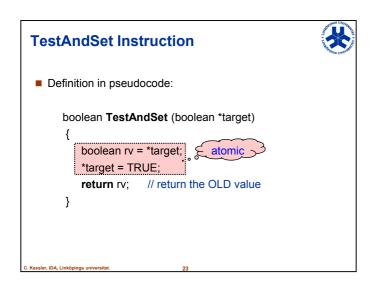
Critical Section: Critical Section: A set of instructions, operating on shared data or resources, that should be executed by a single thread at a time without interruption Atomicity of execution Mutual exclusion: At most one process should be allowed to operate inside at any time Consistency: inconsistent intermediate states of shared data not visible to other processes outside May consist of different program parts for different threads that access the same shared data General structure, with structured control flow: Entry of critical section C

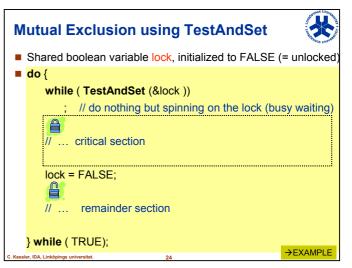
... critical section C: operation on shared data

Exit of critical section C











- CompareAndSwap (adr memcell, value, register)
 - Atomically compares a value in a memory cell to a supplied value and, if these are equal, swaps the contents of the memory cell with the value stored in a register.
- Example: Mutual Exclusion using Compare-And-Swap:

```
register = 1;
CompareAndSwap ( &lock, 0, register );
while (register != 0)
      CompareAndSwap ( &lock, 0, register );
// 🞒 ... critical section
lock = 0;
```

■ More details in the lecture on non-blocking synchronization

Load-linked / Store-conditional Cture



2 new instructions for memory access:

- LoadLinked address, register
 - records the version number of the value read (cf. a svn update)
- StoreConditional register, address
 - will only succeed if no other operations were executed on the accessed memory location since my last LoadLinked instruction to address,

(cf. a svn commit)

 and set the register operand of Store-conditional to 0. otherwise.

Mutual Exclusion using LL ■ Shared int variable lock, initialized to 0 (= unlocked) do { register = 0: while (register == 0) { dummy = LoadLinked (&lock); if (dummy == 0) { // read a 0 - found unlocked register = 1; register = StoreConditional (register, &lock); // if register is 0, StoreConditional failed, retry.. ... critical section lock = 0; // ordinary store

Pitfalls with Semaphores



- Correct use of mutex operations:
 - · Protect all possible entries/exits of control flow into/from critical section:

pthread_mutex_lock (&mutex) pthread_mutex_unlock (&mutex)



- Possible sources of synchronization errors:
 - Omitting lock(&mutex) or unlock(&mutex) (or both) ??
 - lock(&mutex) lock(&mutex) ??
 - lock(&mutex1) unlock(&mutex2) ??
 - if-statement in critical section, unlock in then-branch only

Problems: Deadlock and Starvation



Deadlock - two or more threads are waiting indefinitely for an event that can be caused only by one of the waiting threads

// ... remainder section

while (TRUE);

- Typical example: Nested critical sections
 - Guarded by locks S and Q, initialized to unlocked

wait (Q); wait (S); wait (Q); wait (S); signal (S): signal (Q): signal (Q); signal (S);

Starvation - indefinite blocking. A thread may never get the chance to acquire a lock if the mutex mechanism is not fair.

Deadlock Characterization

[Coffman et al. 1971



Deadlock can arise only if four conditions hold simultaneously:

- Mutual exclusion: only one thread at a time can use a resource.
- Hold and wait: a thread holding at least one resource is waiting to acquire additional resources held by other threads.
- No preemption of resources: a resource can be released only voluntarily by the thread holding it, after that thread has completed its task.
- **Circular wait:** there exists a set $\{P_0, P_1, ..., P_n\}$ of waiting threads such that
 - P₀ is waiting for a resource that is held by P₁,
 - P_1 is waiting for a resource that is held by P_2 , ...,
 - P_{n-1} is waiting for a resource that is held by P_n , and
 - P_n is waiting for a resource that is held by P_n.

Coordinating Shared Access (5)

- Must also rely on implementation for efficiency
- Time to lock / unlock mutex or synchronize threads varies widely between different platforms
- A mutex that all threads access serializes the threads!
 - Convoying
 - Goal: Make critical section as short as possible

// in gettask():

int tmpindex; // local (thread-private) variable pthread_mutex_lock(&mutex); tmpindex = p.index++

pthread_mutex_unlock(&mutex); task = p.queue [tmpindex];-

memory access now outside critical section

Possibly slow shared

Coordinating Shared Access (6)

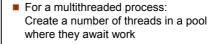


- When programming on this level of abstraction: can minimize serialization, but not avoid
 - Example: Fine-grained locking
- Better: avoid mutex and similar constructs, and use higher-level data structures that are lock-free
 - Example: NOBLE
- Also: Transactional memory

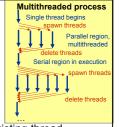
More about this in Lecture 4

Performance Issues with Threads on Multicores

Performance Issue: **Thread Pools**







- Faster to service a request with an existing thread than to create a new thread
- Allows the number of threads in the application(s) to be bound to the size of the pool
- Win32 API
- OpenMP

Performance Issue: **Spinlocks on Multiprocessors**



- Recall busy waiting at spinlocks:
 - . lock initially 0 (unlocked) while (! test_and_set(&lock))

// ... the critical section ... lock = 0:

- Test_and_set in a tight loop → high bus traffic on multiprocessor
 - Cache coherence mechanism must broadcast all writing accesses (incl. t&s) to lock immediately to all writing processors, to maintain a consistent view of lock's value
 - contention
 - degrades performance

Solution 1: TTAS

- Combine with ordinary read: while (! test_and_set(&lock)) while (lock)
 - // ... the critical section ...
- Most accesses to lock are now reads → less contention.
 - as long as lock is not released

Solution 2: Back-Off

- while (!test_and_set(&lock)) do_nothing_for (short_time); // ... the critical section
- Exponential / random back-off

Performance Issue: Manual Avoidance of Idle Waiting



- Thread that unsuccessfully tried to acquire mutex is blocked but not suspended
 - busy waiting, idle ③
- Can find out that mutex is locked and do something else: pthread_mutex_trylock (&mutex_lock);
 - If mutex is unlocked, returns 0 If mutex is locked, returns EBUSY
- Useful for locks that are not accessed too frequently and for threads having the chance to do something else

Performance Issue: Thread Pinning



Programmer may want tight control over thread-to-core mapping of the underlying OS CPU scheduler, e.g. due to:

- Caching, NUMA ("non-uniform memory access [time]") → not all cores are equally "close" to all memory locations → map thread to a specific core (subset) it has "affinity" to
- Application / runtime system might do its own load balancing (see later)
- Measurement reproducibility problem
 - Measured time, energy can vary considerably if the thread mapping changes unexpectedly

Solution: "pin" a thread to a specific core

■ Constrain CPU scheduler to always map it to that same core

Thread Pinning with Pthreads



#include <pthread.h>

```
int pthread setaffinity np (
                                         Bitvector-like data structure
    pthread_t thread,
                                           describing a subset of
    size_t cpusetsize,
                                           the available CPU set):
    const cpu_set_t *cpuset
                                           i th bit = 1 iff core i is in
                                         the affinity set of this thread.
int pthread_getaffinity_np (
    pthread_t thread,
    size t cpusetsize,
    cpu_set_t *cpuset
);
```

Thread Pinning with Pthreads



- Pthreads provides macros for defining and comparing CPU sets.
- Example: pin the current thread to core i (in 0,...,p-1):

```
#include <sched h>
#include <pthread.h>
cpu_set_t cpuset;
CPU ZERO( &cpuset ); // empty CPU mask
CPU_SET ( i, &cpuset ); // set i-th "bit" in cpuset
pthread t this thread = pthread self (); // get this thread's handle
pthread_setaffinity_np ( this_thread, sizeof(cpu_set_t), &cpuset );
```



Better Programmability for Thread Programming

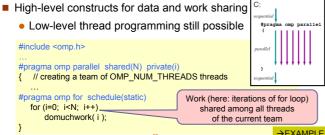
Short overview of OpenMP™

(see TDDC78 for in-depth treatment of OpenMP)

OpenMP™



- Standard for shared-memory thread programming
- Developed for incremental parallelization of HPC code
- Directives (e.g. #pragma omp parallel)
- Support in recent C compilers, e.g. gcc from v.4.3 and later



Performance Issue: **Load Balancing**



- Longest-running process determines parallel execution time ("makespan")
- Minimized by load balancing
 - Static mapping of tasks to cores before runtime, no OH
 - Dynamic mapping done at runtime
 - Shared (critical section) or distributed work pool
 - On-line problem don't know the future, only the past
 - Heuristics such as best-fit, random work stealing

Example: Parallel loop, iterations of unknown+varying workload

#pragma omp parallel for schedule(dynamic) for (i=0; i<N; i++) work (i, unknownworkload(i));</pre>



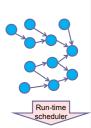
Programming with Tasks

(rather than threads)

Examples: Cilk, Futures

Task-level programming

- Threads are too inflexible, still too coarse-grained, only moderately portable
- Idea: Program for tasks, not for threads
- Lots of tasks, with explicit or implicit dependences
 - · Created dynamically by the application
 - Execute non-preemptively
 - Maintained and scheduled by a run-time system running (at user level) on top of worker threads provided by underlying hardware+OS
 - Scheduling and synchronization of tasks can be driven by operand data-flow
 - · Central task pool vs. Work-stealing scheduler
- Examples:
 - Cilk, CilkPlus, Wool
 - OpenMP 3.0/4.0 task model
 - StarPU for heterogeneous / hybrid multicores
 - StarSS / OmpSS / SMPSS
 - Intel Threading Building Blocks (TBB) runtime system





:1 pinned to core

Cilk

[supertech.csail.mit.edu/cilk]



- algorithmic multi-"threaded" language [Leiserson et al. ~1993]
- Programmer specifies independent tasks and their synchronization points
- Runtime system schedules computation dynamically to a parallel platform
- Extension of C
- fork-join execution style
 - typ. overhead for spawning on SMP ca. 4x time for subroutine call
- Commercial branch Cilk++ for C++, bought by Intel in 2009
 - Intel Cilk™ Plus, part of Intel Parallel Building Blocks
- A similar framework is Wool [Faxén ~2009]

Cilk: Fine-grained multithreading



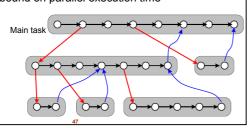
```
cilk int fib (int n)
 if (n < 2) return n;
 else {
    int x, y;
    x = spawn fib (n-1);
    y = spawn fib (n-2);
    sync;
    return (x+y);
```

- · Expose massive, fine-grained thread-level parallelism (tasks)
- · Restricted synchronization no mutual exclusion, possibly non-preemptable execution
- · Use low-overhead dynamic (work-stealing) task scheduler for automatic load balancing
- → Raise the abstraction level: program for tasks, not threads

Execution of Cilk programs



- Cilk tasks may execute local tasks (black edges = continuation of control flow in execution trace), spawn child tasks or synchronize with child tasks (blue dependence edges).
 - · Execution forms a directed acyclic graph (DAG), task graph
 - DAG depth = Length of longest path (critical path) is a lower bound on parallel execution time



Execution of Cilk Programs (2)

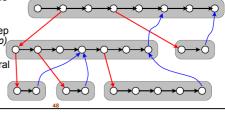


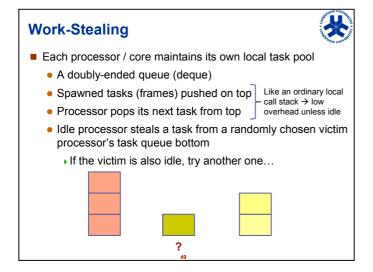
- Execution schedule:
 - maps tasks to processors X time steps (Gantt chart)
 - follows the DAG precedence constraints
 - each processor executes at most one task per time step
- A task is ready for scheduling if all its dependencies are saturated.
- Simple dynamic scheduling algorithm: Greedy (list) scheduling

 Maintain central task pool and the set ("front") of ready tasks

 At each time step issue all (max p ready tasks

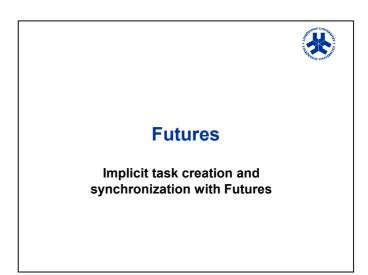
In practice, decentral work-stealing schedulers work well.

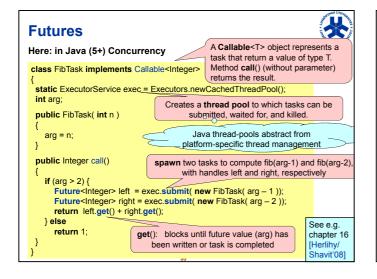




```
Work-Stealing – Implementation (1)
taskqueue tasks; // one per worker thread
                                              void steal_work( victim )
void spawn (taskt)
                                               t = victim.tasks.steal();
                                               if (t != NULL) { // got one:
 myworker.tasks.push(t);
                                                 t.thief = myworker;
                                                 t.result = t.execute();
                                                t.done = TRUE;
void sync() // wait for last spawned subtask:
 (status, t) = myworker.tasks.pop();
 if (status == STOLEN) {
                                              thread worker (id, root_task)
  while (! t.done)
                                               if (id == 0)
                       // wait for t
                                                 root_task.execute();
  return t.result:
                                               else
                                                 forever
 else // have to do it myself:
                                                   steal_work (rand_victim())
  return t.execute();
```

```
Work-Stealing – Implementation (2)
taskqueue tasks; // one per worker thread
                                              void steal_work( victim )
void spawn (taskt)
                                               t = victim.tasks.steal();
                                               if (t != NULL) { // got one:
 myworker.tasks.push(t);
                                                t.thief = myworker;
                                                t.result = t.execute();
                                                t.done = TRUE;
void sync() // wait for last spawned subtask
                                      Why is this
 (status, t) = myworker.tasks.pop();
                                     a good idea?
 if (status == STOLEN) {
                                                   worker ( id, root_task )
   while (! t.done)
    // try to steal back ("leapfroggin
                                               if (id == 0)
     steal work( t.thief );
                                                 root_task.execute();
  return t.result;
                                               else
                                                 forever
 else // have to do it myself:
                                                   steal work (rand victim());
  return t.execute();
```





```
Futures
                  ... = left.get() + ...;
■ A future call by a thread T1 starts a new thread T2
  to calculate one or more values and allocates a
   future cell for each of them.
  T1 is passed a read-reference to each future cell and
  continues immediately.
  T2 is passed a write-reference to each future cell
Such references can be passed on to other threads
■ As (T2) computes results, it writes them to their future cells.
  When any thread touches a future cell via a read-reference,
  the read stalls until the value has been written.
A future cell is written only once but can be read many times.
■ Used e.g. in Tera-C [Callahan/Smith'90], ML+futures
  [Blelloch/Reid-Miller'97], StackThreads/MP [Taura et al.'99],
  Java (5+) Concurrency Package [SUN'04], C++11
```

Future < Integer > left = exec.submit(new FibTask(arg-1));



Questions?

Further Reading (Selection)



- C. Lin, L. Snyder: Principles of Parallel Programming. Addison Wesley, 2008. (general introduction; Pthreads)
- B. Wilkinson, M. Allen: Parallel Programming, 2e. Prentice Hall, 2005. (general introduction; pthreads, OpenMP)
- M. Herlihy, N. Shavit: The Art of Multiprocessor Programming.
 Morgan Kaufmann, 2008. (threads; nonblocking synchronization)
- Chandra, Dagum, Kohr, Maydan, McDonald, Menon: Parallel Programming in OpenMP. Morgan Kaufmann, 2001.
- Barbara Chapman et al.: Using OpenMP Portable Shared Memory Parallel Programming. MIT press, 2007.
- R. Blumofe et al.: Cilk: An efficient multithreaded runtime system.
 J. of Par. and Distr. Comput. 37(1):55-69, Aug. 1996.
- C. Augonnet et al.: StarPU: A Unified Platform for Task Scheduling on Heterogeneous Multicore Architectures. Concurrency and Computation: Practice and Experience 23:187-198, Feb. 2011.

Other references



- OpenMP: www.openmp.org
- NOBLE library of non-blocking data structures www.cse.chalmers.se/research/group/noble/
- Cilk "algorithmic multithreading" supertech.csail.mit.edu/cilk
- Intel CilkPlusTM www.cilkplus.org
- Wool fine grained independent task parallelism in C www.sics.se/~kff/wool
- StarPU library/runtime system for heterogeneous multicores starpu.gforge.inria.fr
- StarSs / OmpSs with Nanos++ runtime system www.bsc.es

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