

PACT 08

Productive Parallel Programming in PGAS

Calin Cascaval
Gheorghe Almasi- IBM TJ Watson Research CenterGheorghe Almasi- IBM TJ Watson Research CenterEttore Tiotto- IBM Toronto LaboratoryKit Barton- IBM Toronto Laboratory

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Outline

- **1.** Overview of the PGAS programming model
- **2.** Scalability and performance considerations
- **3.** Compiler optimizations
- **4.** Examples of performance tuning
- **5.** Conclusions



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1. Overview of the PGAS programming model

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Partitioned Global Address Space

- Explicitly parallel, shared-memory like programming model
- Global addressable space
 - Allows programmers to declare and "directly" access data distributed across the machine

Partitioned address space

- Memory is logically partitioned between *local* and *remote* (a two-level hierarchy)
- Forces the programmer to pay attention to data locality, by exposing the inherent NUMA-ness of current architectures

Single Processor Multiple Data (SPMD) execution model

- All threads of control execute the **same** program
- Number of threads fixed at startup
- Newer languages such as X10 escape this model, allowing fine-grain threading

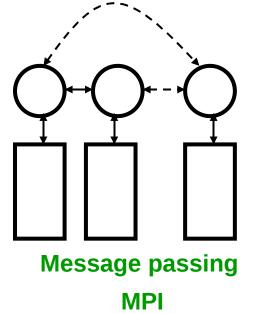
Different language implementations:

- UPC (C-based), CoArray Fortran (Fortran-based), Titanium and X10 (Java-based)

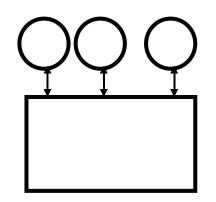
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Partitioned Global Address Space



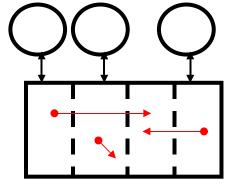
) Process/Thread



Shared Memory

OpenMP

Address Space



PGAS

UPC, CAF, X10

- Computation is performed in multiple places.
- A place contains data that can be operated on remotely.
- Data lives in the place it was created, for its lifetime.

- A datum in one place may point to a datum in another place.
- Data-structures (e.g. arrays) may be distributed across many places.
- Places may have different computational properties (mapping to a hierarchy of compute engines)

A place expresses locality.

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UPC Overview and Design Philosophy

• Unified Parallel C (UPC) is:

- An explicit parallel extension of ANSI C
- A partitioned global address space language

Similar to the C language philosophy

- Programmers are clever and careful, and may need to get close to hardware
 - to get performance, but
 - can get in trouble
- Concise and efficient syntax
- Common and familiar syntax and semantics for parallel C with simple extensions to ANSI C
- Based on ideas in Split-C, AC, and PCP



UPC Execution Model

• A number of threads working independently in a SPMD fashion

- Number of threads available as program variable THREADS
- MYTHREAD specifies thread index (0..THREADS-1)
- upc_barrier is a global synchronization: all wait
- There is a form of parallel loop that we will see later

There are two compilation modes

– Static Threads mode:

- THREADS is specified at compile time by the user (compiler option)
- The program may use THREADS as a compile-time constant
- The compiler generates more efficient code

- Dynamic threads mode:

- Compiled code may be run with varying numbers of threads
- THREADS is specified at runtime time by the user (via env. variable)



Hello World in UPC

- Any legal C program is also a legal UPC program
- If you compile and run it as UPC with N threads, it will run N copies of the program (Single Program executed by all threads).

```
#include <upc.h>
#include <stdio.h>
int main() {
  printf("Thread %d of %d: Hello UPC world\n", MYTHREAD,
THREADS);
  return 0;
hello > xlupc helloWorld.upc
hello > env UPC_NTHREADS=4 ./a.out
Thread 1 of 4: Hello UPC world
Thread 0 of 4: Hello UPC world
Thread 3 of 4: Hello UPC world
Thread 2 of 4: Hello UPC world
```

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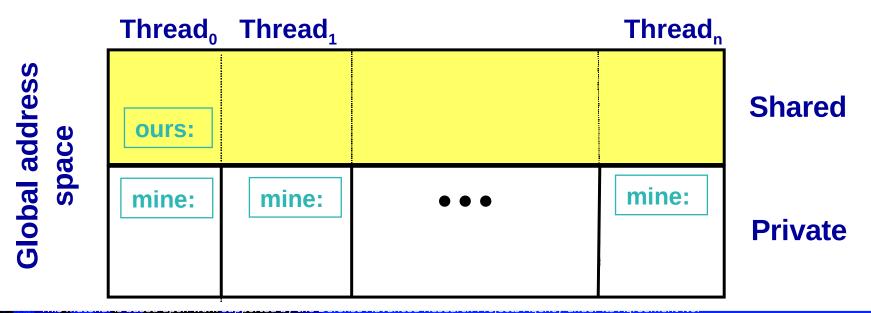


Private vs. Shared Variables in UPC

- Normal C variables and objects are allocated in the private memory space for each thread.
- Shared variables are allocated only once, with thread 0

```
shared int ours;
int mine;
```

Shared variables may not be declared automatic, i.e., may not occur in a in a function definition, except as static. Why?



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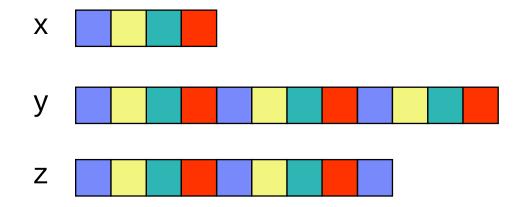
Shared Arrays

Shared arrays are spread over the threads, distributed in a cyclic fashion

shared int x[THREADS]; shared int y[3][THREADS]; shared int z[3][3];

- /* 1 element per thread */
- /* 3 elements per thread */
- /* 2 or 3 elements per thread */

Assuming THREADS = 4:



Think of a linearized C array, then map roundrobin on THREADS



Work Sharing with upc_forall()

- The owner computes rule is very common in parallel programming
 - Loop over all; work on those owned by this proc
- UPC adds a special type of loop

upc_forall(init; test; loop; affinity)
 statement;

- Programmer indicates the iterations are independent
 - Undefined if there are dependencies across threads
- Affinity expression indicates which iterations to run on each thread. It may have one of two types:
 - Integer: affinity%THREADS is MYTHREAD

upc_forall(i=0; i<N; ++i; i)</pre>

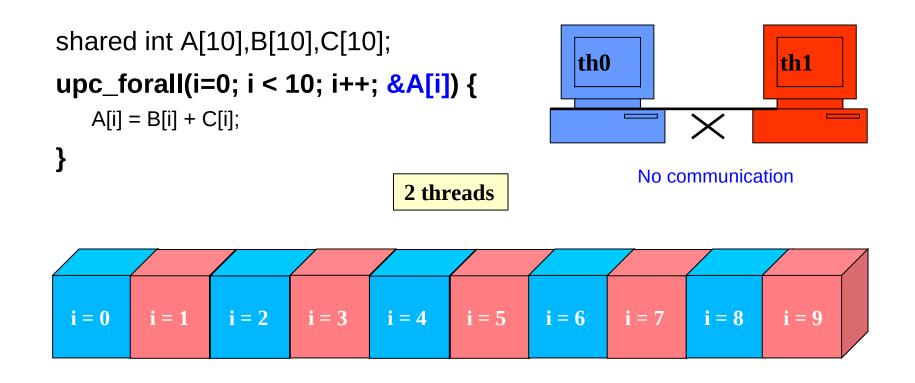
- Pointer: upc_threadof(affinity) is MYTHREAD

upc_forall(i=0; i<N; ++i; &A[i])</pre>



Work Sharing with upc_forall()

- Similar to C for loop, 4th field indicates the affinity
- Thread that "owns" elem. A[i] executes iteration





Vector Addition with upc_forall

```
#define N 100*THREADS
shared int v1[N], v2[N], sum[N];
void main() {
    int i;
    upc_forall(i=0; i<N; i++; i)
        sum[i]=v1[i]+v2[i];
}</pre>
```

- Equivalent code could use "&sum[i]" for affinity
- The code would be correct but slow if the affinity expression were i+1 rather than i.



UPC Global Synchronization

- Controls relative execution of threads
- UPC has two basic forms of barriers:
 - Barrier: block until all other threads arrive upc_barrier
 - Split-phase barriers

upc_notify; this thread is ready for barrier
do computation unrelated to barrier

upc_wait; wait for others to be ready

Optional labels allow for debugging

```
#define MERGE_BARRIER 12
if (MYTHREAD%2 == 0) {
    ...
    upc_barrier MERGE_BARRIER;
} else {
    ...
    upc_barrier MERGE_BARRIER;
}
```



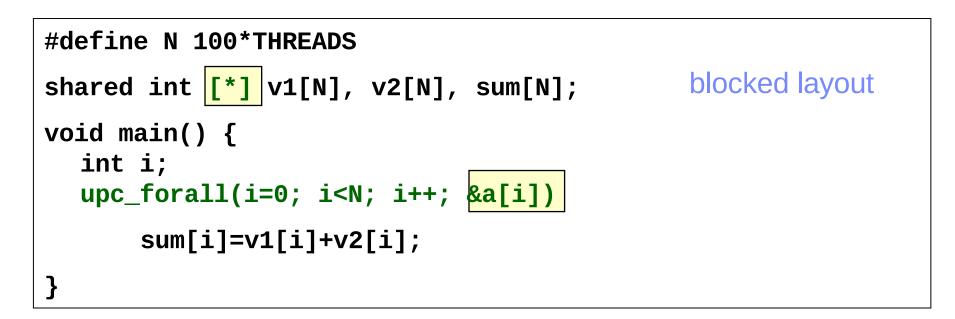
Recap: Shared Variables, Work sharing and Synchronization

- With what you've seen until now, you can write a barebones data-parallel program
- Shared variables are distributed and visible to all threads
 - Shared scalars have affinity to thread 0
 - Shared arrays are distributed (cyclically by default) on all threads
 - We shall look next at how to control memory layouts, shared pointers, etc.
- Execution model is SPMD with the upc_forall provided to share work
- Barriers and split barriers provide global synchronization



Blocked Layouts in UPC

- The cyclic layout is typically stored in one of two ways
 - Distributed memory: each processor has a chunk of memory
 - Thread 0 would have: 0,THREADS, THREADS*2,... in a chunk
 - Shared memory machine: all data may be on one chunk
 - Shared memory would have: 0,1,2,...THREADS,THREADS+1,...
- Vector addition example can be rewritten as follows



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Layouts in General

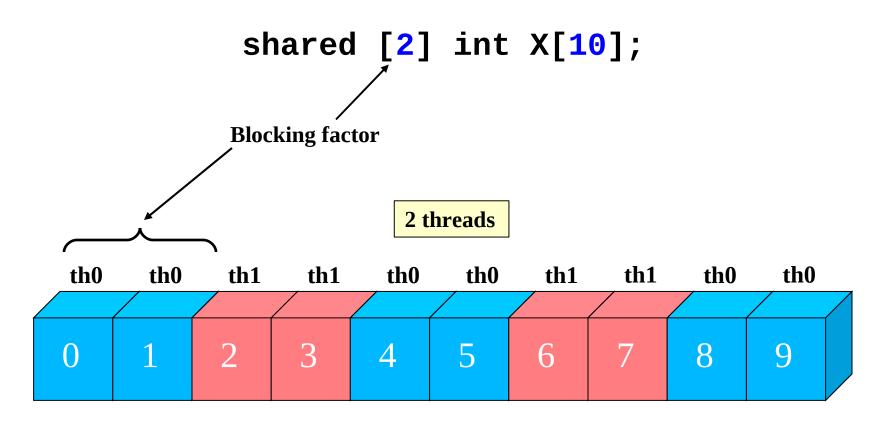
- All non-array objects have affinity with thread zero.
- Array layouts are controlled by layout specifiers:
 - Empty (cyclic layout)
 - [*] (blocked layout)
 - [0] or [] (indefinitely layout, all on 1 thread)
 - [b] or [b1][b2]...[bn] = [b1*b2*...bn] (fixed block size)
- The affinity of an array element is defined in terms of:
 - block size, a compile-time constant
 - and THREADS.
- Element i has affinity with thread
 - (i / block size) % THREADS
- In 2D and higher, linearize the elements as in a C representation, and then use above mapping

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Distribution of a shared array in UPC

- Elements are distributed in block-cyclic fashion
- Each thread "owns" blocks of adjacent elements



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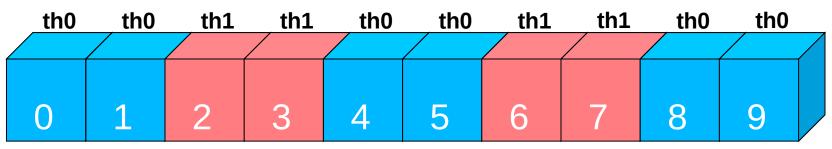


Physical layout of shared arrays

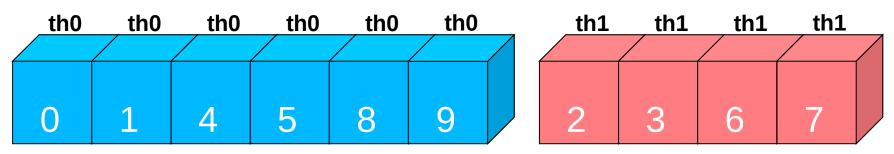
shared [2] int X[10];

2 threads

Logical Distribution



Physical Distribution

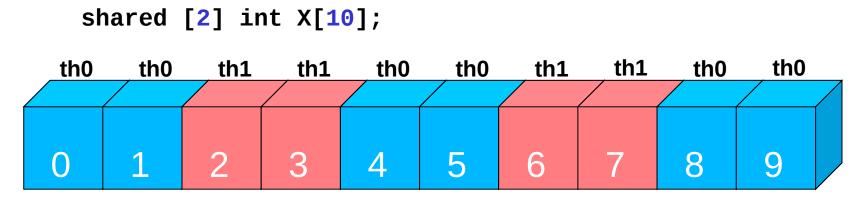


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Terminology



upc_threadof(&a[i])

- Thread that owns a[i]

upc_phaseof(&a[i])

- The position of a[i] within its block

course(&a[i])

- The block index of a[i]

Examples

- $upc_threadof(\&a[2]) = 1$
- $upc_threadof(\&a[5]) = 0$
- $upc_phaseof(\&a[2]) = 0$
- $upc_phaseof(\&a[5]) = 1$
- course(&a[2]) = 0course(&a[5]) = 1

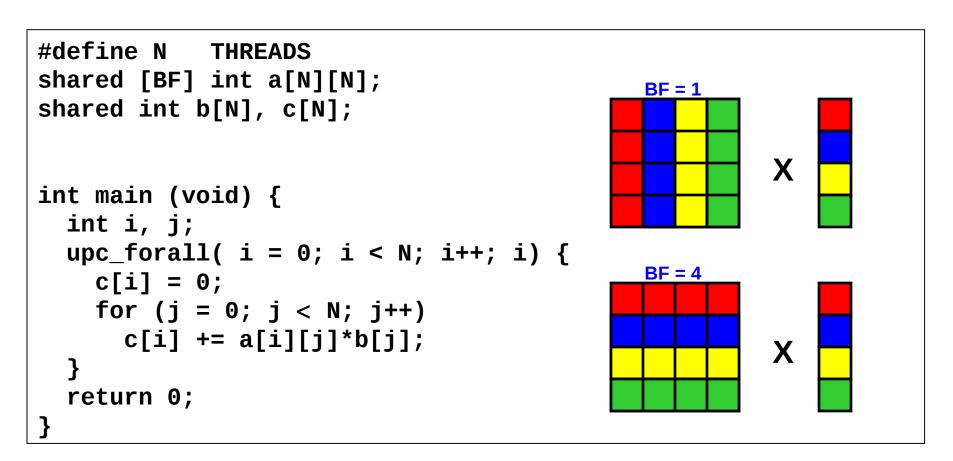
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UPC Matrix Vector Multiplication Code

Matrix-vector multiplication with matrix stored by rows

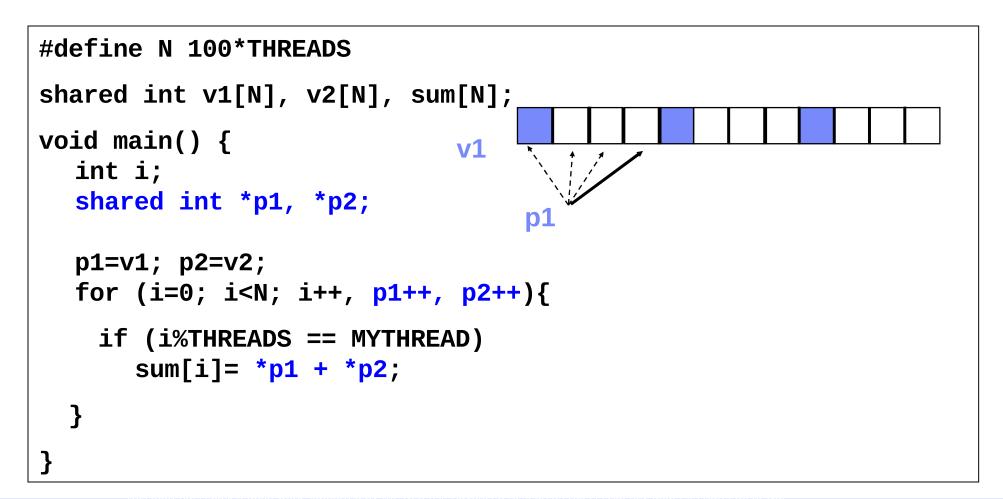


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Pointers to Shared vs. Arrays

- In the C tradition, array can be access through pointers
- Here is the vector addition example using pointers



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UPC Pointers

Where does the pointer point to?

		Local	Shared
Where does the pointer reside?	Private	PP (p1)	PS (p3)
	Shared	SP (p2)	<mark>SS (</mark> p4)

int *p1; shared int *p2;

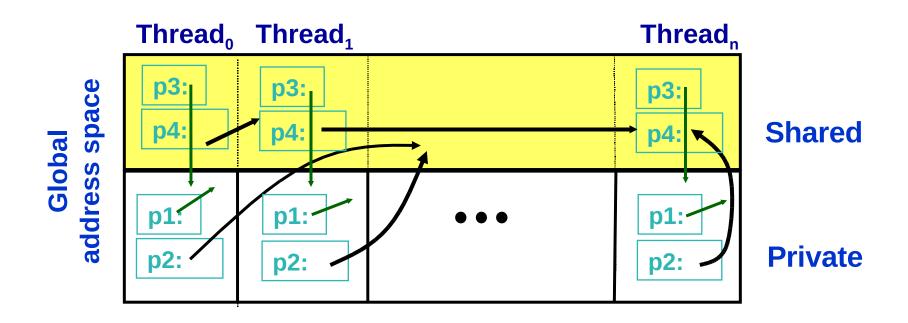
/* private pointer to local memory */ /* private pointer to shared space */ int *shared p3; /* shared pointer to local memory */ shared int *shared p4; /* shared pointer to shared space */

Shared to private is not recommended. Why?

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UPC Pointers



int *p1; /* private pointer to local memory
*/

shared int *p2; /* private pointer to shared space
*/

int *shared p3; /* shared pointer to local memory Pointers to shared often require more storage and are more costly to demeterince; they anay refer to local or remote memory ared space

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Common Uses for UPC Pointer Types

int *p1;

- These pointers are fast (just like C pointers)
- Use to access local data in part of code performing local work
- Often cast a pointer-to-shared to one of these to get faster access to shared data that is local

shared int *p2;

- Use to refer to remote data
- Larger and slower due to test-for-local + possible communication

int * shared p3;

Not recommended

shared int * shared p4;

- Use to build shared linked structures, e.g., a linked list

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UPC Pointers

- Pointer arithmetic supports blocked and non-blocked array distributions
- Casting of shared to private pointers is allowed but not vice versa !
- When casting a pointer to shared to a private pointer, the thread number of the pointer to shared may be lost
- Casting of shared to private is well defined only if the object pointed to by the pointer to shared has affinity with the thread performing the cast



Pointer Query Functions

- size_t upc_threadof(shared void *ptr);
 - returns the thread number that has affinity to the pointer to shared
- size_t upc_phaseof(shared void *ptr);
 - returns the index (position within the block)field of the pointer to shared
- size_t upc_addrfield(shared void *ptr);
 - returns the address of the block which is pointed at by the pointer to shared
- shared void *upc_resetphase(shared void *ptr);
 - resets the phase to zero



Synchronization primitives

- We have seen upc_barrier, upc_notify and upc_wait
- UPC supports locks:
 - Represented by an opaque type: upc_lock_t
 - Must be allocated before use:

upc_lock_t *upc_all_lock_alloc(void);

allocates 1 lock, pointer to all threads

upc_lock_t *upc_global_lock_alloc(void);

allocates 1 lock, pointer to all threads

- To use a lock:

void upc_lock(upc_lock_t *1)

void upc_unlock(upc_lock_t *1)

use at start and end of critical region

Locks can be freed when not in use

void upc_lock_free(upc_lock_t *ptr);



Dynamic memory allocation

- As in C, memory can be dynamically allocated
- UPC provides several memory allocation routines to obtain space in the shared heap
 - shared void* upc_all_alloc(size_t nblocks, size_t nbytes)
 - a collective operation that allocates memory on all threads
 - layout equivalent to: shared [nbytes] char[nblocks * nbytes]
 - shared void* upc_global_alloc(size_t nblocks, size_t nbytes)
 - A non-collective operation, invoked by one thread to allocate memory on all threads
 - layout equivalent to: shared [nbytes] char[nblocks * nbytes]
 - shared void* upc_alloc(size_t nbytes)
 - A non-collective operation to obtain memory in the thread's shared section of memory
 - void upc_free(size_t nbytes)
 - A non-collective operation to free data allocated in shared memory
 - Why do we need just one version?



Distributed arrays allocated dynamically

```
typedef shared [] int *sdblptr;
shared sdblptr directory[THREADS];
```

```
int main() {
    ...
    directory[MYTHREAD] = upc_alloc(local_size*sizeof(int));
    upc_barrier;
    ...
    /* use the array */
    upc_barrier;
    upc_free(directory[MYTHREAD]);
```

}



Data movement

- Fine grain (array element, by array element access) are easy to program in an imperative way. However, especially on distributed memory machines, block transfers are more efficient
- UPC provides library functions for data movement and collective operations:
 - upc_memset
 - Set a block of values in shared memory
 - upc_memget, upc_memput
 - Transfer blocks of data from shared memory to/from private memory
 - upc_memcpy
 - Transfer blocks of data from shared memory to shared memory
- Collective operations (broadcast, reduce, etc.)
 - A set of function calls is specified in the standard, but it's being reworked. More about this a bit later



Memory Consistency

- The consistency model defines the order in which one thread may see another threads accesses to memory
 - If you write a program with unsychronized accesses, what happens?
 - Does this work?

data = …	<pre>while (!flag) { };</pre>			
flag = 1;	= data;	// use the data		

- UPC has two types of accesses:
 - Strict: will always appear in order
 - Relaxed: may appear out of order to other threads
- There are several ways of designating the type, commonly:
 - Use the include file:

#include <upc_relaxed.h>

- Which makes all accesses in the file relaxed by default
- Use strict on variables that are used as synchronization (flag)



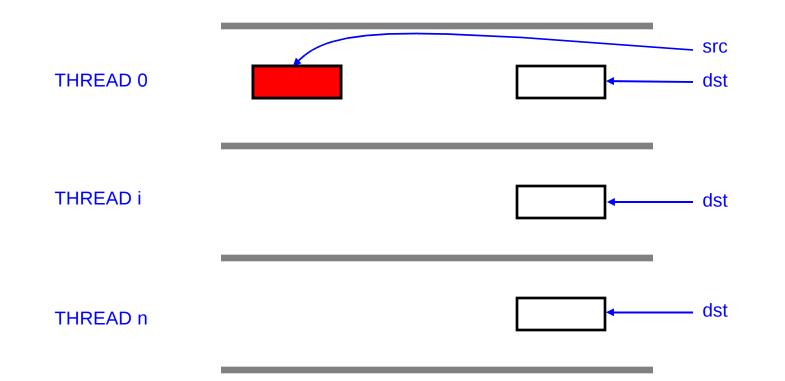
Data movement Collectives

- Used to move shared data across threads:
 - upc_all_broadcast(shared void* dst, shared void* src, size_t nbytes, ...)
 - A thread copies a block of memory it "owns" and sends it to all threads
 - upc_all_scatter(shared void* dst, shared void *src, size_t nbytes, ...)
 - A single thread splits memory in blocks and sends each block to a different thread
 - upc_all_gather(shared void* dst, shared void *src, size_t nbytes, ...)
 - Each thread copies a block of memory it "owns" and sends it to a single thread
 - upc_all_gather_all(shared void* dst, shared void *src, size_t nbytes, ...)
 - Each threads copies a block of memory it "owns" and sends it to all threads
 - upc_all_exchange(shared void* dst, shared void *src, size_t nbytes, ...)
 - Each threads splits memory in blocks and sends each block to all thread
 - upc_all_permute(shared void* dst, shared void *src, shared int* perm, size_t nbytes, ...)
 - Each threads copies a block of memory and sends it to thread in perm[i]

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upc_all_broadcast

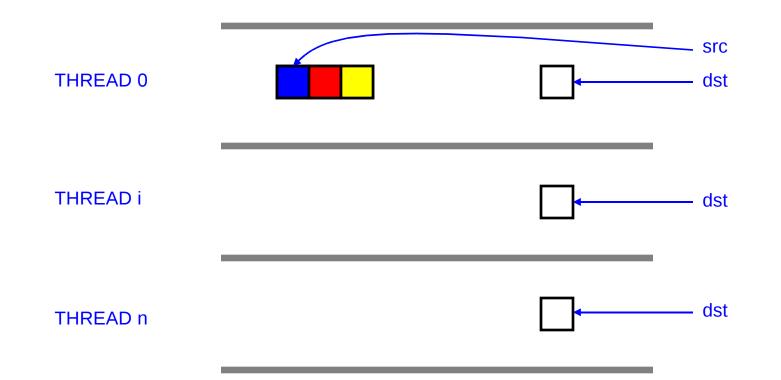


Thread 0 copies a block of memory and sends it to all threads

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upc_all_scatter

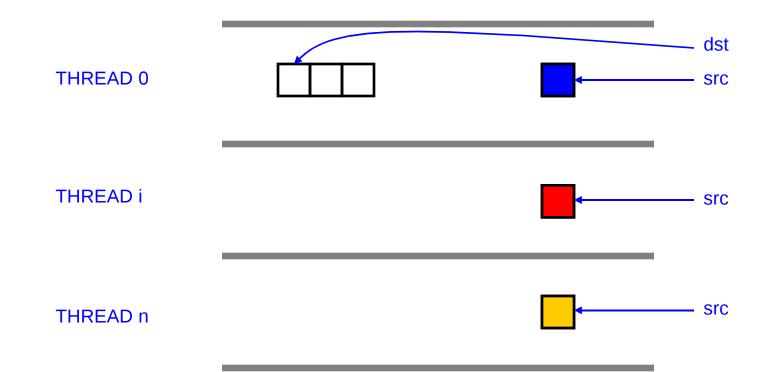


Thread 0 sends a unique block to all threads

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upc_all_gather



Each thread sends a block to thread 0

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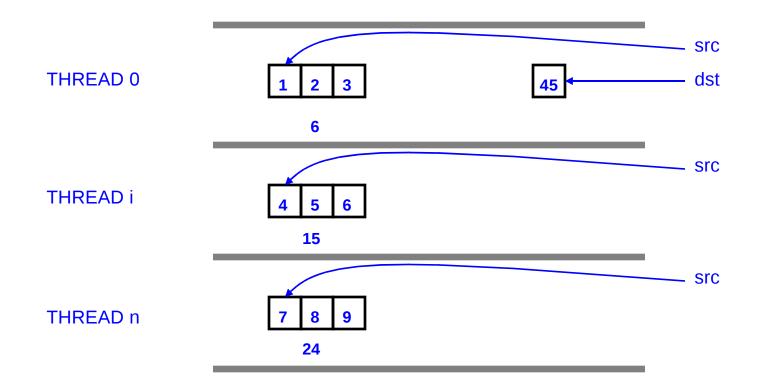


Computational Collectives

- Used to perform data reductions
 - upc_all_reduceT(shared void* dst, shared void* src, upc_op_t op, ...)
 - upc_all_prefix_reduceT(shared void* dst, shared void *src, upc_op_t op, ...)
- One version for each type T (22 versions in total)
- Many operations are supported:
 - OP can be: +, *, &, |, xor, &&, ||, min, max
 - perform OP on all elements of src array and place result in dst array



upc_all_reduce



Threads perform partial sums, each partial sum added and result stored on thread 0



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Scalability and performance considerations

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Scalability: Rules of thumb

Things to avoid:

- UPC tempts user into fine-grain communication
- UPC tempts user into bad data layouts
- The siren song of UPC locks

Things to take advantage of:

- Global view makes reasoning about program easier
 - The "G" ins PGAS
- Collective communication



Simple sum: Introduction

Simple forall loop to add values into a sum

```
shared int values[N], sum;
sum = 0;
upc_forall (int i=0; i<N; i++; &values[i])
    sum += values[i];
```

- Is there a problem with this code ?
- Implementation is broken: "sum" is not guarded by a lock
- Write-after-write hazard; will get different answers every time



Simple sum: using locks

Easy you say ... let's use a lock !

```
shared int values[N], sum;
upc_lock_t mylock;
upc_forall (int i=0; i<N; i++; &values[i]) {
    upc_lock (&mylock);
    sum += values[i];
    upc_unlock (&mylock);
}
```

Correct implementation ©©©

- But horrible performance 888
- Lock is used for every array value !!!

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Simple sum: minimizing lock use

- Better performance if N >> THREADS
- Still O(N) communication!

```
shared int values[N], sum;
shared int partialsums[THREADS];
partialsum[MYTHREAD]=0;
upc_forall (int i=0; i<N; i++; &values[i]) {
    partialsum[MYTHREAD] += values[i];
}
upc_forall (int i=0; i<THREADS; i++; partialsums[i]) {
    upc_lock (&mylock);
    sum += partialsums[i];
    upc_unlock (&mylock);
}
```



Simple sum: avoiding locks

Assuming N = k * THREADS (or array padded with zeroes)

shared int values[N], sum;

```
upc_all_reduceI (&sum,
        values,
        UPC_ADD,
        THREADS,
        N/THREADS,
        NULL,
        UPC IN ALLSYNC|UPC OUT ALLSYNC);
```

Typical O(log(n)) scalability (like MPI reductions)

Your lesson: avoid locks! There is almost always a better solution



Access Granularity: Stencil

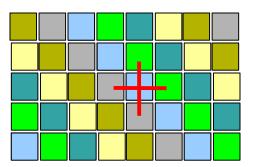
Naive solution:

Communication traffic: 4 * N * N * THREADS elements 4 * N * N * THREADS accesses

```
shared double A[N][N];
```

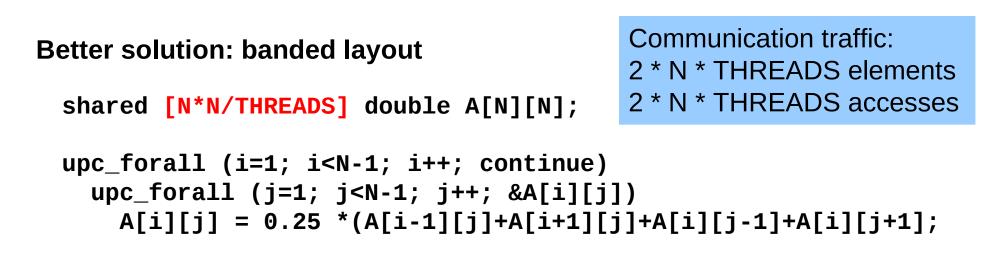
```
upc_forall (i=1; i<N-1; i++; continue)
    upc_forall (j=1; j<N-1; j++; &A[i][j])
    A[i][j] = 0.25 *(A[i-1][j]+A[i+1][j]+A[i][j]-1]+A[i][j+1];</pre>
```

This is bad because all accesses right of 0.25 are likely non-local.

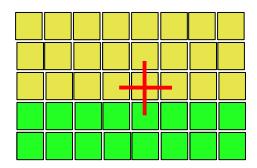




Access Granularity: Banded Stencil



Better, because only 2*N accesses per thread are non-local





Access Granularity: Shadow Exchange

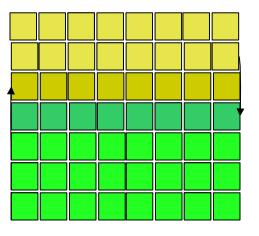
Banded layout with shadow regions:

```
#define B (N*(N+2*THREADS)/THREADS)
shared [B] double A[N+2*THREADS][N];
```

Communication traffic: 2 * N * THREADS elements 2 * THREADS accesses

```
/* stencil code as usual */
```

Shadow region exchange



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Access Granularity: Tiled layout

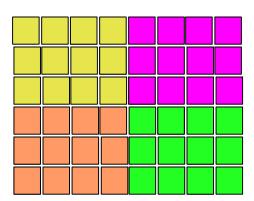
Tiled layout (UPC extension)

```
#define B
shared [B][B] double A[N][N];
```

Communication traffic: 4 * N * sqrt(T) elements 4 * T accesses

Very complicated code (exchange buffers are not contiguous) (*)

Highly scalable: per-thread communication costs <u>decrease</u> with scaling



^(*) compiler aggregation optimization can help keep code small

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Matrix multiplication: Introduction

shared double A[M][P], B[P][N], C[M][N];

```
forall (i=0; i<M; i++; continue)
forall (j=0; j<N; j++; &C[i][j])
for (k=0; k<P; k++)
C[i][j] += A[i][k]*B[k][j];</pre>
```

Problem:

- Accesses to A and B are mostly non-local
- Fine grain remote access == bad performance!



Matrix multiplication: Block matrices

```
shared struct { int x[B][B]; } A[M1][P1], B[P1][N1], C[M1]
  [N1];
```

```
forall (i=0; i<M1; i++; continue)</pre>
  forall (j=0; j<N1; j++; &C[i][j])</pre>
     for (k=0; k<P1; k++) {</pre>
        upc_memget (alocal, &A[i][k], B*B*sizeof(double));
        upc_memget (blocal, &B[k][j], B*B*sizeof(double));
        dgemm (alocal, blocal, &C[i][j]);
     }
```

- Good:

- Fewer accesses, large granularity
- Improved single-node performance (ESSL library call)

- Bad:

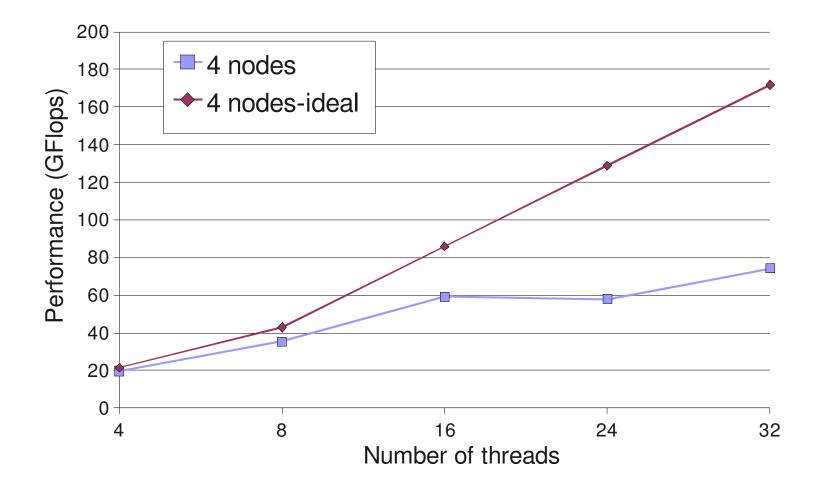
- Code has changed significantly
- Still not scalable performance: O(n³) communication

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Blocked Matrix Multiply scaling P5 cluster, 4 nodes x 8 threads/node



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Matrix multiplication: New Layout

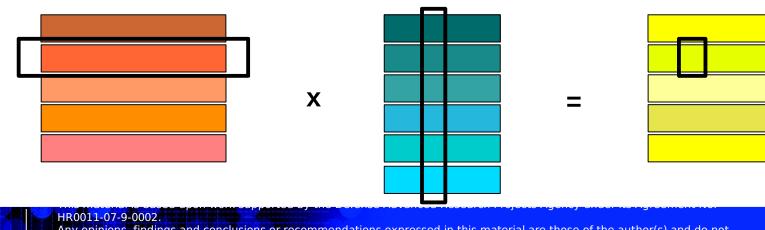
```
typedef shared { int x[B][B]; } Block;
shared [M1*sizeof(Block)] Block A[M1][P1];
shared [P1*sizeof(Block)] Block B[P1][N1];
shared [M1*sizeof(Block)] Block C[M1][N1];
```

Good:

- no locality issues on A and C (traversing the same way)

Bad:

- B is traversed across block layout (communication!)





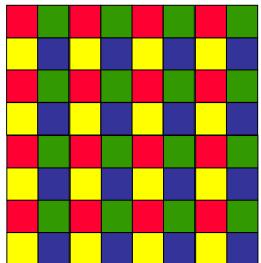
Matrix Multiplication: Tiled Layouts

#pragma processors C(Tx, Ty)
shared [B][B] double C[M][N];

- Good:
 - Allows control of block placement on processor grid
 - Allows C to be accessed as array, not as struct
 - Allows communication among rows, cols of processors (scalable communication)

Bad:

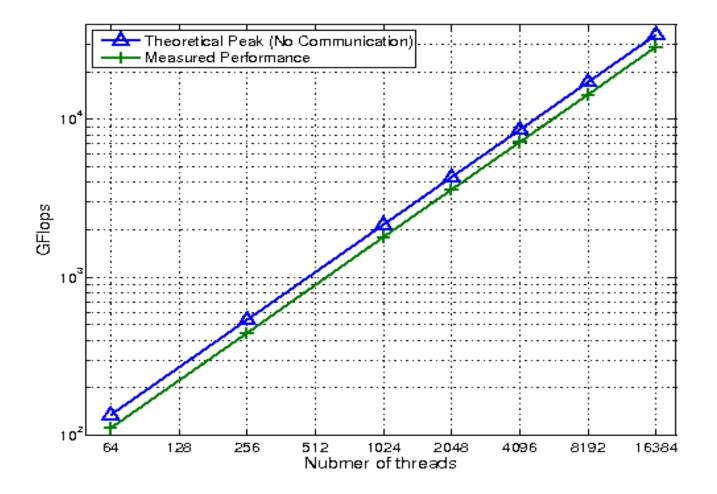
- UPC extension: not available in vanilla UPC
- Not <u>yet</u> available in IBM UPC
- Good:
 - Attempting to add this into standard



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Scalability: Matrix multiplication: Tiled layout key to performance



UPC matrix multiplication on a 16-rack Blue Gene/L

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PACT 08

3. Compiler optimizations

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UPC hybrid runtime stack

xIUPC Front-end (based on xlc) locality-TPO (High level optimizations + UPC specific optimizations) aware **UPC** compiler/runtime API shared deref collective startup memory threaded **SVD** assign array allocation shutdown API indexing update Internal UPC API **Distributed UPC API** distrib PERCS BlueGene Myrinet TCP/IP uted LAPI GM / MX HFI sockets Messag.

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XL-UPC Runtime System

Designed for scalability

Implementations available for

- SMP using pthreads
- Clusters using LAPI
- BlueGene/L using the BG/L message layer
- Provides a unique API to the compiler for all the above implementations
- Provides management of and access to shared data in a scalable manner using the Shared Variable Directory



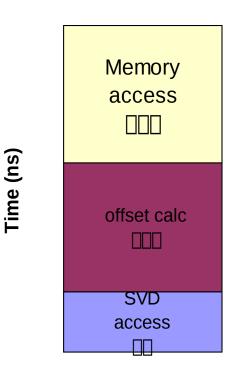
Anatomy of a shared access

shared [BF] int A[N],B[N],C[N]; upc_forall (i=0; i < N, ++i; &A[i]) A[i] = B[i] + C[i];

Generated code (loop body):

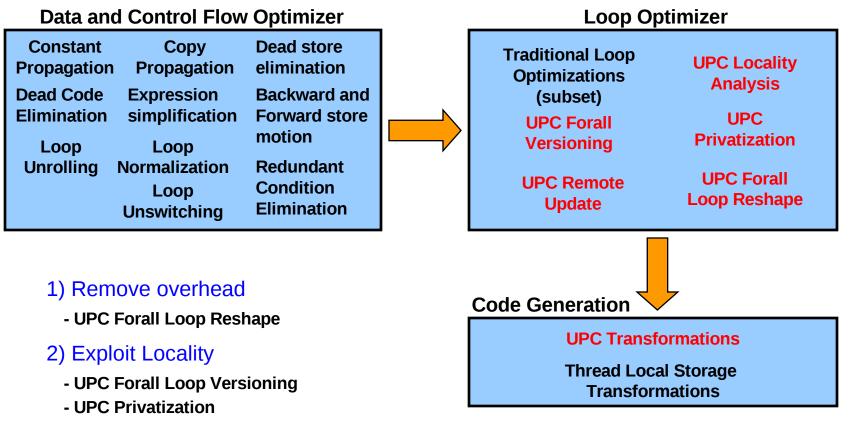
```
__xlupc_deref_array(C_h, __t1, i, sizeof(int), ...);
__xlupc_deref_array(B_h, __t2, i, sizeof(int), ...);
__t3 = __t1 + __t2;
__xlupc_assign_array(A_h, __t3, i, sizeof(int), ...);
```

Anatomy of a runtime call





UPC Optimizer Infrastructure



- 3) Reduce communication
 - UPC Remote Update

Optimizer infrastructure applicable to other PGAS languages (Co-Array Fortran)

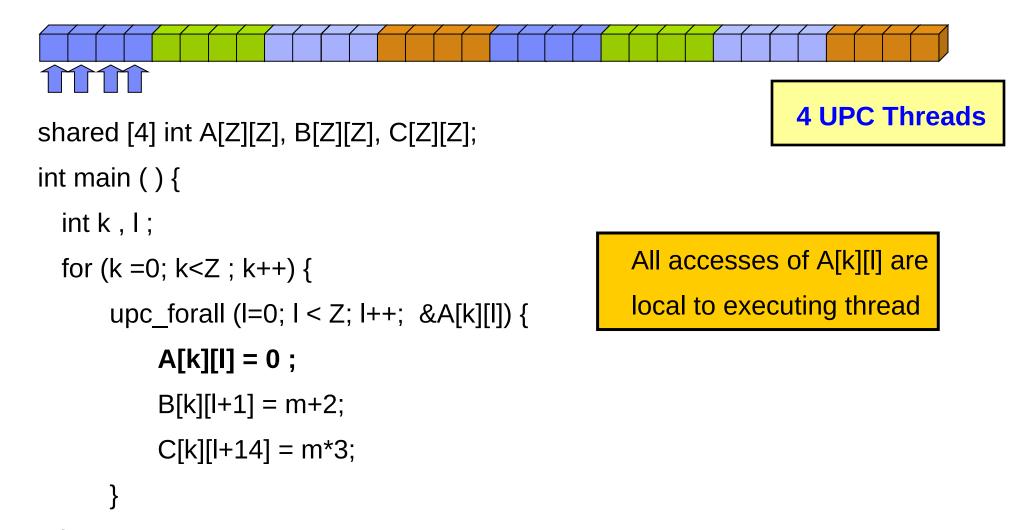
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Optimizing Shared Object Accesses

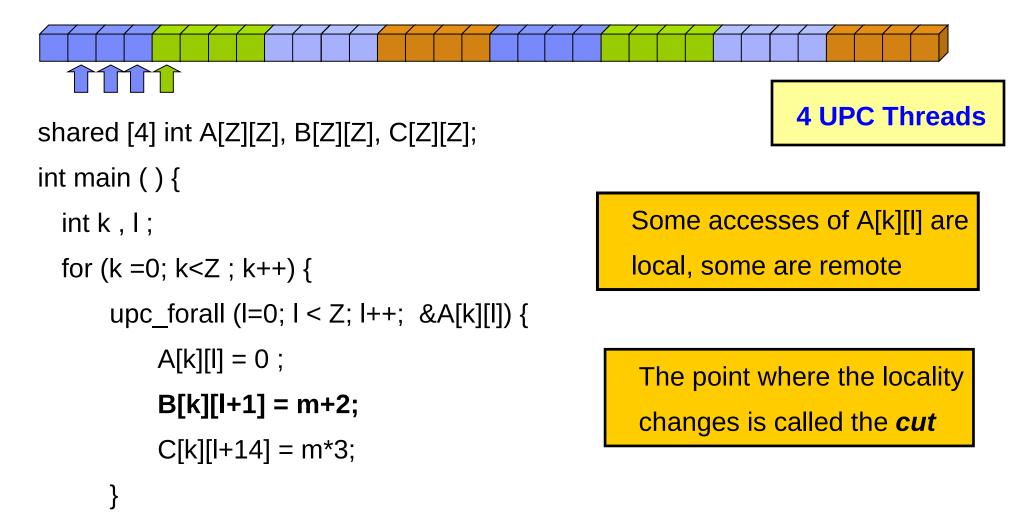
- When shared data is accessed, function calls to the RTS are used to set or get the shared data
- The calls to the RTS use the Shared Variable Directory (SVD) to locate the shared data
 - This lookup requires several pointer dereferences and is expensive
- When the compiler can determine the *relative* thread that owns each shared reference, it can perform several different optimizations to reduce the overhead of RTS calls





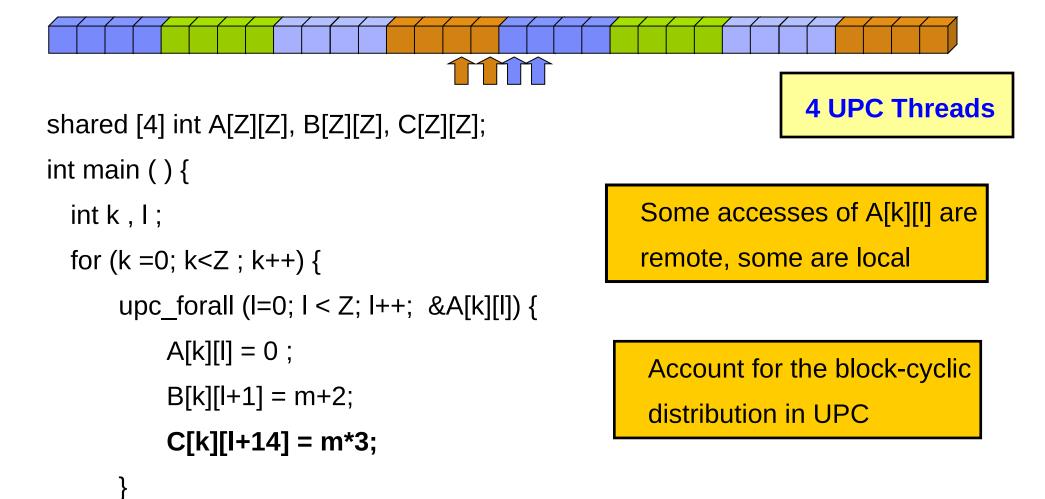
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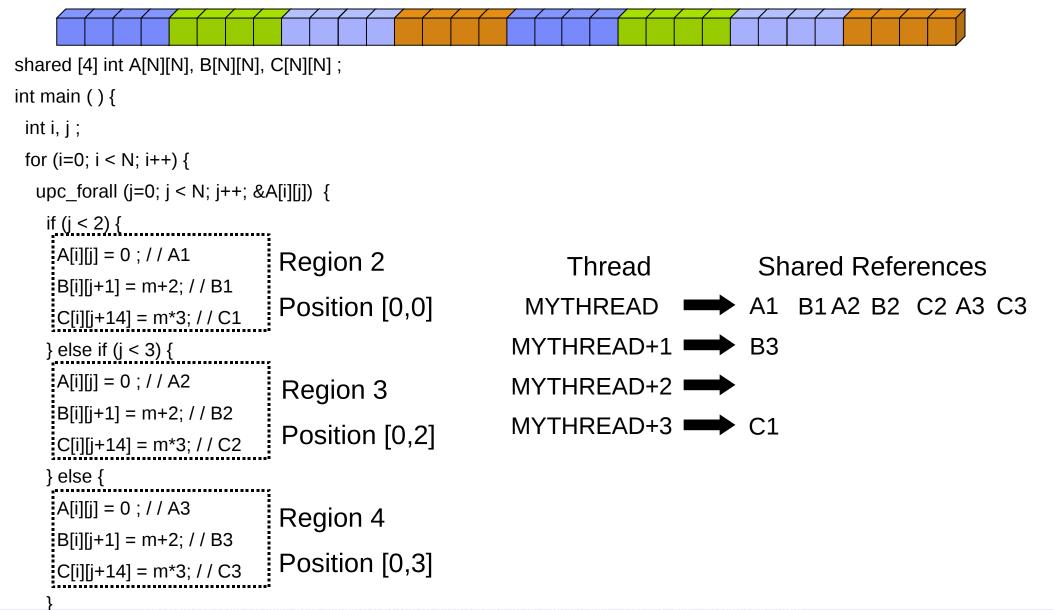




- Compiler refactors the original loop nest into regions where the locality is constant
- The regions are created using cuts
- Once the loop is refactored, the compiler builds a Shared Reference Map that maps the shared references to the relative thread that owns them



Shared Reference Map



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Shared Reference Map

- The shared reference map gives the compiler information about the relative thread that owns each shared reference
- The shared reference map is not concerned about machine configuration
- This information can then be used to perform locality optimizations
 - Privatization: Local shared references can be accessed directly without requiring the RTS
 - Coalescing: Remote shared references owned by the same thread can be accessed in groups
 - Scheduling: Remote shared references that require communication



Shared Object Access Privatization

- All shared references that map to MYTHREAD in the SRM are *local* to the accessing thread
- Machine architecture can also be used to find accesses for co-located threads
- Compiler converts each local shared-object access into a traditional C pointer access
 - Base address obtained from RTS once
 - Offset computed based on index and shared array shape



SOAP Example: Stream Triad

```
#define SCALAR 3.0
shared double a[N], b[N], c[N];
void StreamTriad() {
 int i;
 upc forall(i=0;i<N;i++;&a[i])
  a[i] = b[i] + SCALAR*c[i];
}
Naïve transformation results in
   3 calls to the UPC Runtime
        in every iteration
```

#define SCALAR 3.0 shared double a[N], b[N], c[N]; void StreamTriad() { int i; upc_forall(i=0; i<N; i++; i) { _xlupc_deref_array(c_h, tmp1, i); _xlupc_deref_array(b_h, tmp2, i); tmp3 = tmp2 + 3.0*tmp1;_xlupc_assign_array(a_h, tmp3, i);

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SOAP Example: Stream Triad

Get base addresses outside of loop

#define SCALAR 3.0

```
shared double a[N], b[N], c[N];
```

void StreamTriad() {

```
int i;
```

```
upc_forall(i=0;i<N;i++;&a[i])
```

```
a[i] = b[i] + SCALAR*c[i];
```

#define SCALAR 3.0 shared double a[N], b[N], c[N]; void StreamTriad() { int i; aBase = ____xlupc_base_address(a_h); bBase = ___xlupc_base_address(b_h); cBase = ___xlupc_base_address(c_h); upc forall(i=0;i<N;i++;&a[i]) { aOffset = ComputeOffset(i); bOffset = ComputeOffset(i); cOffset = ComputeOffset(i); *(aBase+aOffset) = *(bBase+bOffset) +

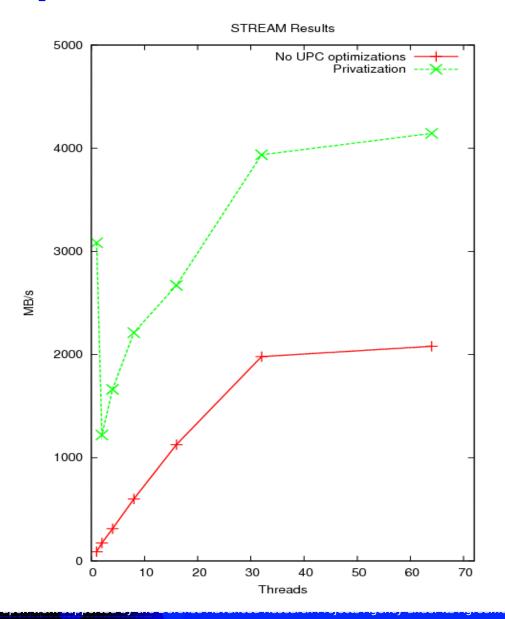
SCALAR*(*(cBase + cOffset));

Traditional "C" pointer access

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SOAP Example: Stream Triad



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Shared Object Access Coalescing

- All shared references that map to the same remote thread can be *coalesced* together
- This reduces the number of messages, thereby reducing the execution time
- Requires support from the UPC Runtime
- Current runtime interface requires coalesced shared references to have
 - The same base symbol
 - The same owner
 - The same type (read or write)

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SOAC Example: Sobel Edge Detection

shared [COLUMNS] BYTE orig[ROWS][COLUMNS];
shared [COLUMNS] BYTE edge[ROWS][COLUMNS];
int Sobel() {

Shared arrays blocked by row

int i, j, gx, gy;

double gradient;

```
for (i=1; i < ROWS-1; i++) {
```

```
upc_forall (j=1; j < COLUMNS-1; j++; &orig[i][j]) {
```

gx = (int) orig[i-1][j+1] - orig[i-1][j-1];

```
gx += ((int) orig[i][j+1] - orig[i][j-1]) * 2;
```

```
gx += (int) orig[i+1][j+1] - orig[i+1][j-1];
```

```
gy = (int) orig[i+1][j-1] - orig[i-1][j-1];
```

```
gy += ((int) orig[i+1][j] - orig[i-1][j]) * 2;
```

```
gy += (int) orig[i+1][j+1] - orig[i-1][j+1];
```

```
gradient = sqrt((gx*gx) + (gy*gy));
```

```
if (gradient > 255) gradient = 255;
```

```
edge[i][j] = (BYTE) gradient;
```

Loop body contains 12 shared array access 3 Local Accesses

9 Remote Accesses

SOAC Example: Sobel Edge Detection

shared [COLUMNS] BYTE orig[ROWS][COLUMNS]; shared [COLUMNS] BYTE edge[ROWS][COLUMNS];

int Sobel() {

```
int i, j, gx, gy;
```

double gradient;

for (i=1; i < ROWS-1; i++) {

```
upc_forall (j=1; j < COLUMNS-1; j++; &orig[i][j]) {
```

gx = (int) orig[i-1][j+1] - orig[i-1][j-1];

```
gx += ((int) orig[i][j+1] - orig[i][j-1]) * 2;
```

```
gx += (int) orig[i+1][j+1] - orig[i+1][j-1];
```

```
gy = (int) orig[i+1][j-1] - orig[i-1][j-1];
```

```
gy += ((int) orig[i+1][j] - orig[i-1][j]) * 2;
```

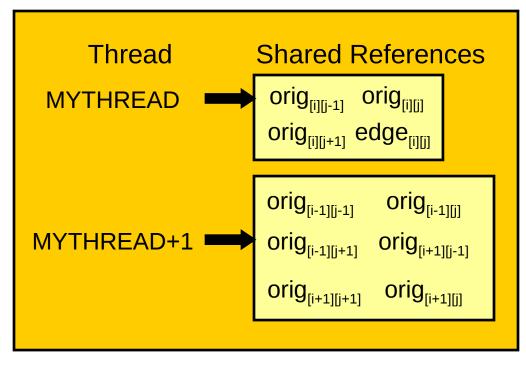
```
gy += (int) orig[i+1][j+1] - orig[i-1][j+1];
```

gradient = sqrt((gx*gx) + (gy*gy));

if (gradient > 255) gradient = 255;

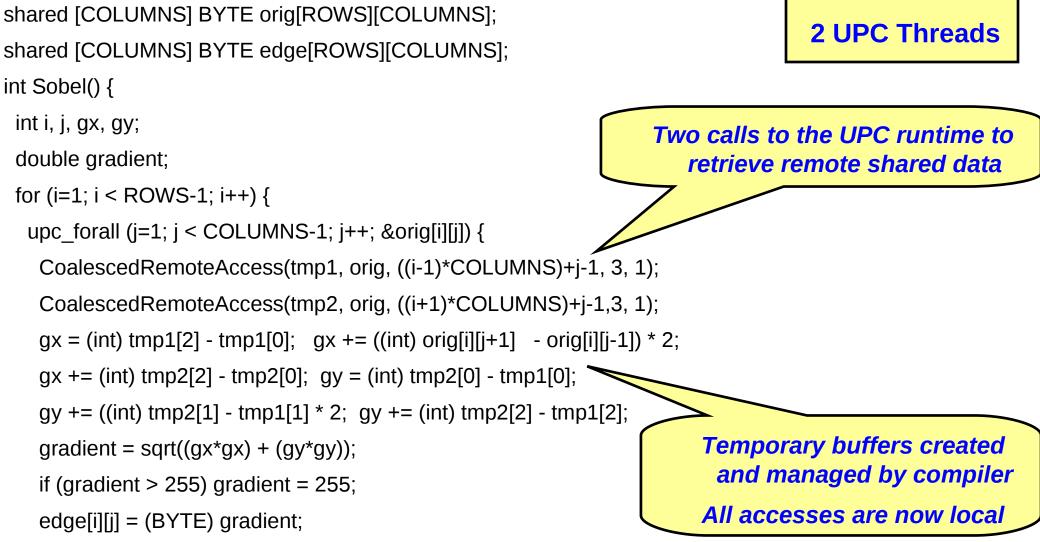
edge[i][j] = (BYTE) gradient;





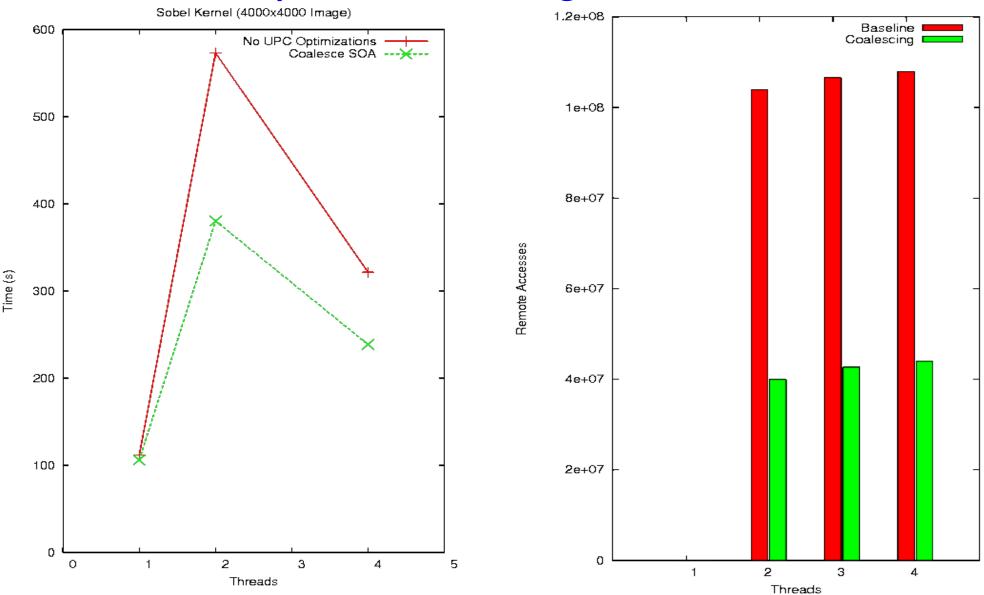


SOAC Example: Sobel Edge Detection





SOAC Example: Sobel Edge Detection



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Shared-Object Access Scheduling

In UPC when a thread executes a runtime call it will wait until the call has been serviced.

Runtime calls are blocking, but we could use nonblocking pairs of calls (notify/wait)

req = __xlupc_deref_array_elt_post(...);

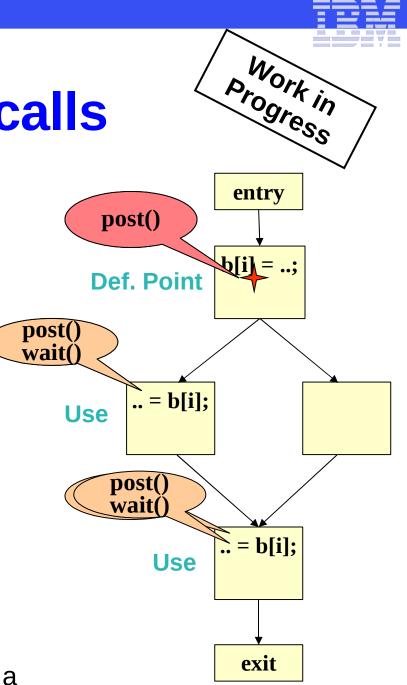
___xlupc_wait(req);

- Notify call initiates the RT access of the shared object
- Wait call should be placed before the first use

Scheduling of post/wait calls

GOAL: place the post call as early as possible

- Collect shared loads used in a loop
- Split the blocking calls in a post/wait pair
- Find the definition point of the shared ref.
- Move the post call to the earliest program point with the following properties:
 - shared ref. is executed on all paths from P to exit
 - P is dominated by its shared ref. definition
- Redundant post calls for the same object can be eliminated
- Consecutive post calls may be aggregated in a bulk transfer



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SOAS Example: Synthetic Benchmark

```
shared double MySharedData[SDS], RemoteData[SDS];
double MyPrivateData[PDS];
void Compute() {
 int i, j, k;
 double sum=0.0;
 upc_forall (i=0; i < SHARED_DATA_SIZE; i++; &MySharedData[i]) {
  for (j=0; j < PRIVATE_DATA_SIZE; j++) {
                                                        Local Computation
   sum += MyPrivateData[i];
  }
  MySharedData[i] = sum * RemoteData[(i+1)%(SDS)];
                                                            Remote access
                                                         Execution waits until
                                                            access is finished
```

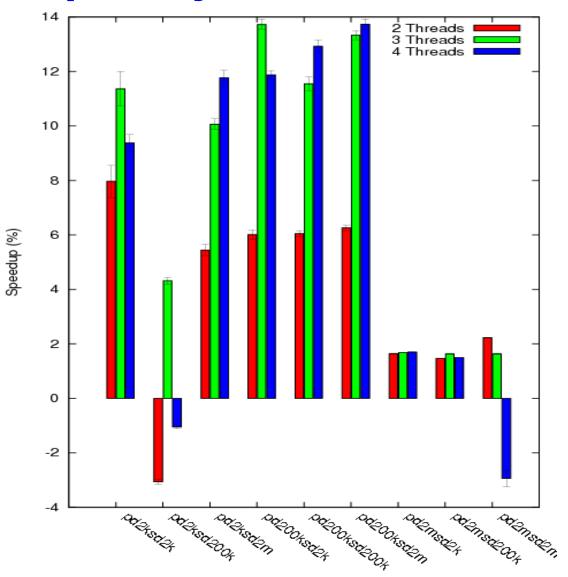


SOAS Example: Synthetic Benchmark

shared double MySharedData[SDS], RemoteData[SDS]; double MyPrivateData[PDS]; void Compute() { Prefetch first iteration int i, j, k; double sum=0.0; wait = deref array post(RemoteData h, MYTHREAD); upc forall (i=0; i < SHARED DATA SIZE; i++; &MySharedData[i]) { for (j=0; j < PRIVATE DATA SIZE; j++) { Local Computation sum += MyPrivateData[j]; Wait for data from previous iteration offset=THREADS; deref array wait(wait); Prefetch next iteration tmp2 = tmp;if (i+THREADS) < SHARED DATA SIZE) wait = deref array post(RemoteData h,&tmp,(i+THREADS+1)%SHARED DATA SIZE); MySharedData[i] = sum * tmp2;



SOAC Example: Synthetic Benchmark



Private and Shared Data Sizes

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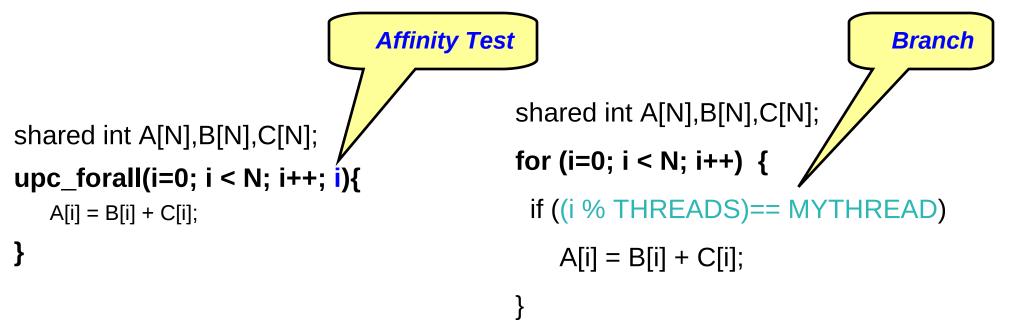
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The upc_forall work-sharing construct

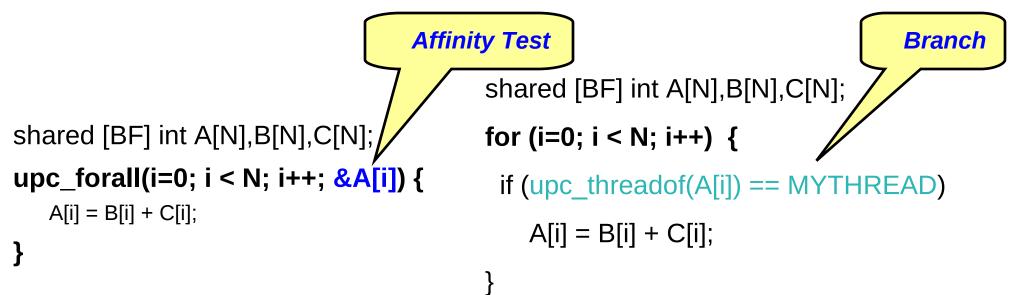
- Similar to C for loop, 4th field indicates the affinity
 - Integer affinity: Thread with ID == affinity value executes the iteration
 - Pointer-to-shared affinity: thread that "owns" shared element executes the iteration
- Affinity test exec. on each iteration by all threads





The upc_forall work-sharing construct

- Similar to C for loop, 4th field indicates the affinity
 - Integer affinity: Thread with ID == affinity value executes the iteration
 - Pointer-to-shared affinity: thread that "owns" shared element executes the iteration
- Affinity test exec. on each iteration by all threads



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Parallel Loop Reshaping (Integer Affinity)

- Iteration space is partitioned
- Each thread starts executing at iteration MYTHREAD
- Each thread executes every THREADs elements

```
shared int A[N],B[N],C[N];
upc_forall(i=0; i < N; i++; i){
        A[i] = B[i] + C[i];
}</pre>
```

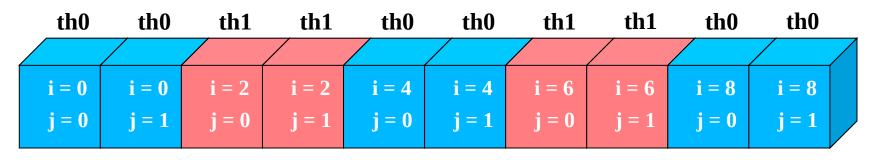
}



Strip-mining optimization

Create a 2-level loop nest

- Outer loop iterates over blocks owned by MYTHREAD
- Inner loop iterates through each block element



shared [2] int A[N], B[N], C[N];

for (i=MYTHREAD * 2; i < N; i+= THREADS*2) {

for (j=i; j < i+BF; j++) A[j] = B[i]+C[i];

}



- Consider an upper-triangle parallel loop nest that uses pointer-to-shared affinity
- Shared array elements are initialized to -1
- Shared array elements are assigned the thread ID of their owner

```
shared [ 2 ] double A[ 6 ] [ 6 ] ;
void UpperTriangularLoop ( ) {
    int i , j ;
    for (i =0; i < 6 ; i ++)
        upc_forall (j=i; j<6; j++; &A[i][j])
        A[ i ] [ j ] = ( double ) MYTHREAD;
}</pre>
```

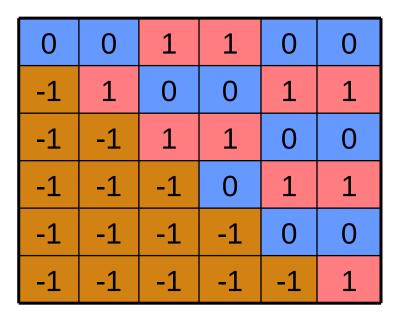
0	0	1	1	0	0
-1	1	0	0	1	1
-1	-1	1	1	0	0
-1	-1	-1	0	1	1
-1	-1	-1	-1	0	0
-1	-1	-1	-1	-1	1

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- For every iteration of the i loop, the upc_forall loop has a different iteration vector
- Thus, the compiler must compute the bounds of the new loop nest at runtime

```
shared [ 2 ] double A[ 6 ] [ 6 ] ;
void UpperTriangularLoop ( ) {
    int i , j ;
    for (i =0; i < 6 ; i ++)
        upc_forall (j=i; j<6; j++; &A[i][j])
        A[i] [j] = (double) MYTHREAD;
}</pre>
```





- The compute bound functions determine the iteraton vector for the new loop nests at runtime
 - For each iteration of the i loop, compute the position of the next block owned by thread MYTHREAD

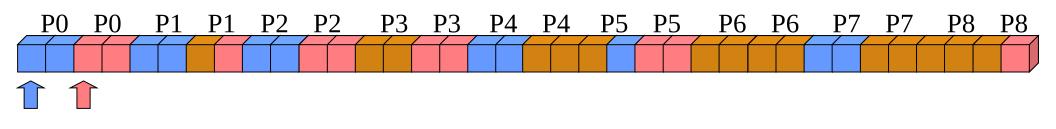
```
shared [ 2 ] double A[ 6 ] [ 6 ] ;
void UpperTriangularLoop() {
    int i, j;
    outerLB = ComputeOuterLowerBound();
    outerUB = ComputeOuterUpperBound();
    innerLB = ComputeInnerLowerBound();
    innerUB = ComputeInnerUpperBound();
    innerUB = ComputeInnerUB; I < innerUB; I < innerU
```

0	0	1	1	0	0
-1	1	0	0	1	1
-1	-1	1	1	0	0
-1	-1	-1	0	1	1
-1	-1	-1	-1	0	0
-1	-1	-1	-1	-1	1

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}





Thread 0 Thread 1 i=0 P=0, C=0 P=0, C=0

i=1

- i=2
- i=3
- i=4

i=5

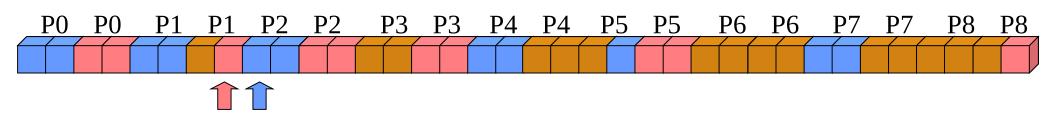
0	0	1	1	0	0
-1	1	0	0	1	1
-1	-1	1	1	0	0
-1	-1	-1	0	1	1
-1	-1	-1	-1	0	0
-1	-1	-1	-1	-1	1

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	Thread 0	Thread 1
i=0	P=0, C=0	P=0, C=0
i=1	P=2, C=0	P=1, C=1
i=2		
i=3		
i=4		
i=5		

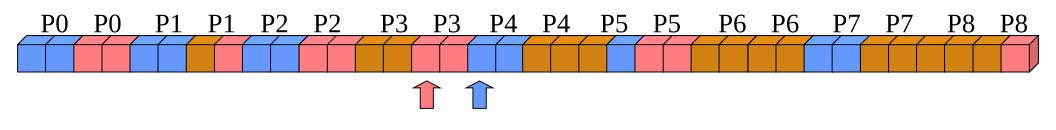
0	0	1	1	0	0
-1	1	0	0	1	1
-1	-1	1	1	0	0
-1	-1	-1	0	1	1
-1	-1	-1	-1	0	0
-1	-1	-1	-1	-1	1

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	Thread 0	Thread 1
i=0	P=0, C=0	P=0, C=0
i=1	P=2, C=0	P=1, C=1
i=2	P=4, C=0	P=3, C=0
i=3		
i=4		
i=5		

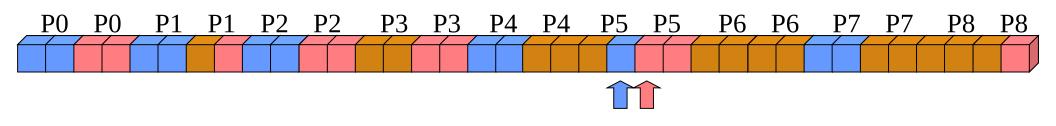
0	0	1	1	0	0
-1	1	0	0	1	1
-1	-1	1	1	0	0
-1	-1	-1	0	1	1
-1	-1	-1	-1	0	0
-1	-1	-1	-1	-1	1

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	Thread 0	Thread 1
i=0	P=0, C=0	P=0, C=0
i=1	P=2, C=0	P=1, C=1
i=2	P=4, C=0	P=3, C=0
i=3	P=5, C=1	P=5, C=0
i=4		
i=5		

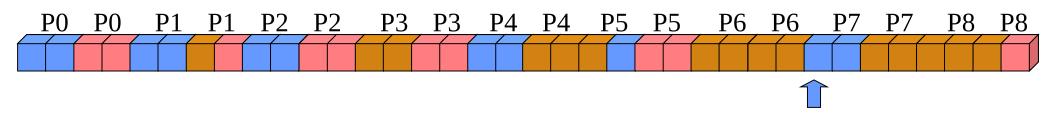
0	0	1	1	0	0
-1	1	0	0	1	1
-1	-1	1	1	0	0
-1	-1	-1	0	1	1
-1	-1	-1	-1	0	0
-1	-1	-1	-1	-1	1

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	Thread 0	Thread 1
i=0	P=0, C=0	P=0, C=0
i=1	P=2, C=0	P=1, C=1
i=2	P=4, C=0	P=3, C=0
i=3	P=5, C=1	P=5, C=0
i=4	P=7, C=0	P=0, C=0
i=5		

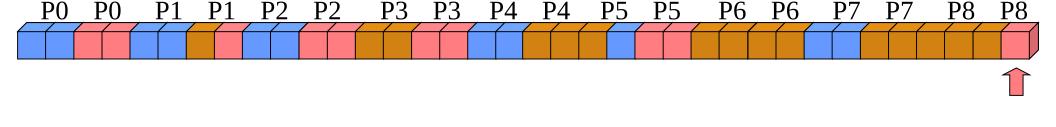
0	0	1	1	0	0
-1	1	0	0	1	1
-1	-1	1	1	0	0
-1	-1	-1	0	1	1
-1	-1	-1	-1	0	0
-1	-1	-1	-1	-1	1

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	Thread 0	Thread 1
i=0	P=0, C=0	P=0, C=0
i=1	P=2, C=0	P=1, C=1
i=2	P=4, C=0	P=3, C=0
i=3	P=5, C=1	P=5, C=0
i=4	P=7, C=0	P=0, C=0
i=5	P=0, C=0	P=8, C=1

1						
	0	0	1	1	0	0
	-1	1	0	0	1	1
	-1	-1	1	1	0	0
	-1	-1	-1	0	1	1
	-1	-1	-1	-1	0	0
	-1	-1	-1	-1	-1	1

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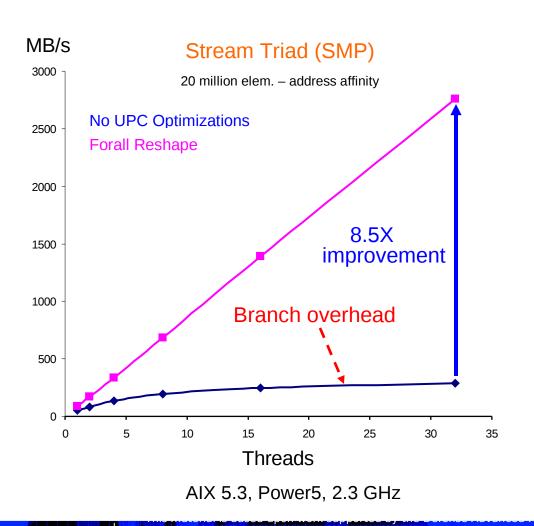
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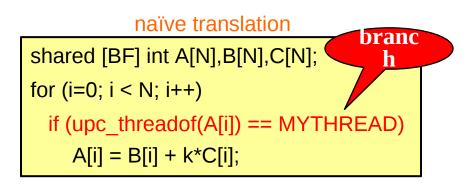




Objective: remove branch overhead in naïve upc_forall translation



shared [BF] int A[N],B[N],C[N]; upc_forall (i=0; i < N; i++; &A[i]) A[i] = B[i] + k*C[i];



optimized loop

shared [BF] int A[N], B[N], C[N];

for (i=MYTHREAD*BF; i<N; i+=THREADS*BF)</pre>

for (j=i; j < i+BF; j++)

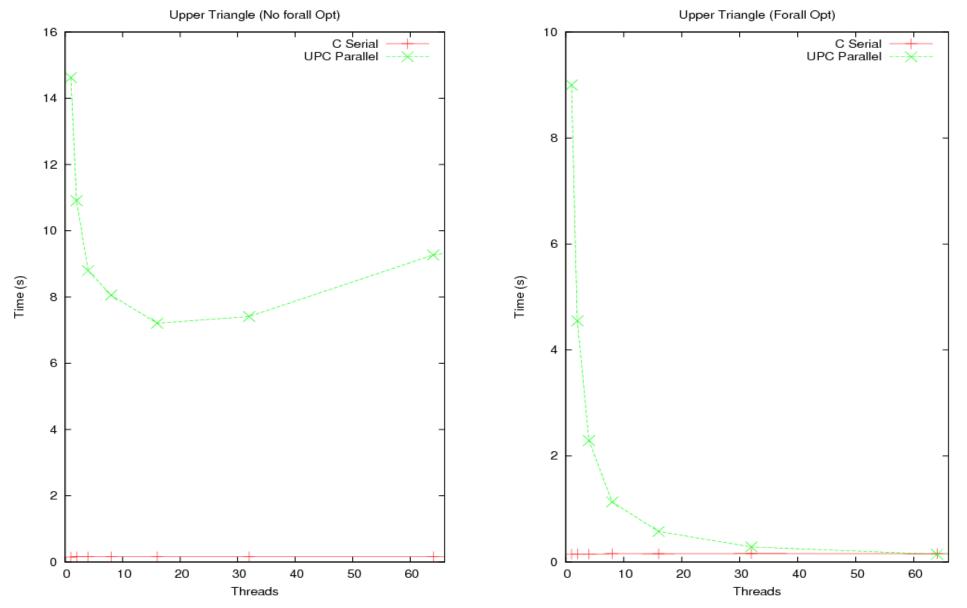
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Parallel Loop Reshaping



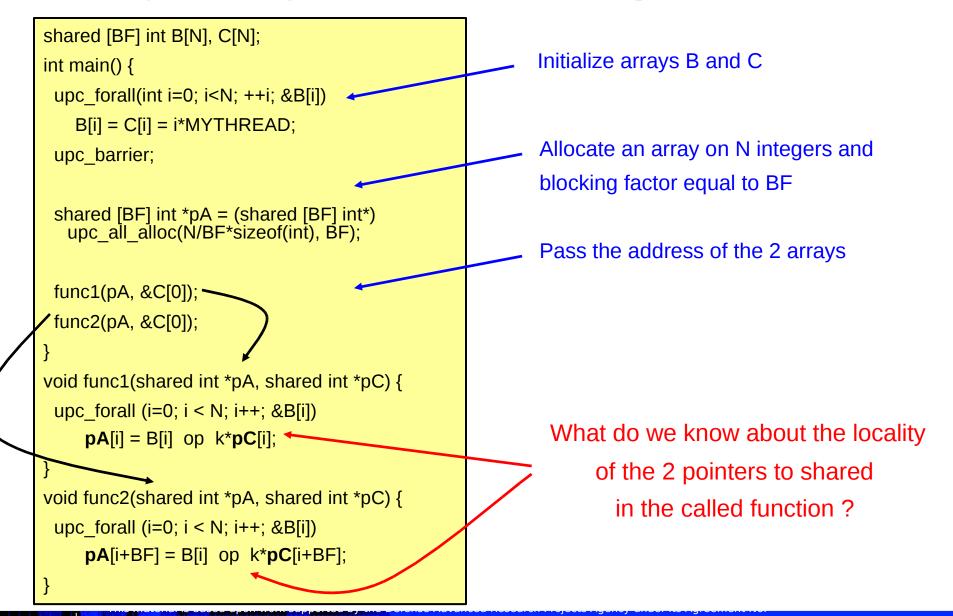
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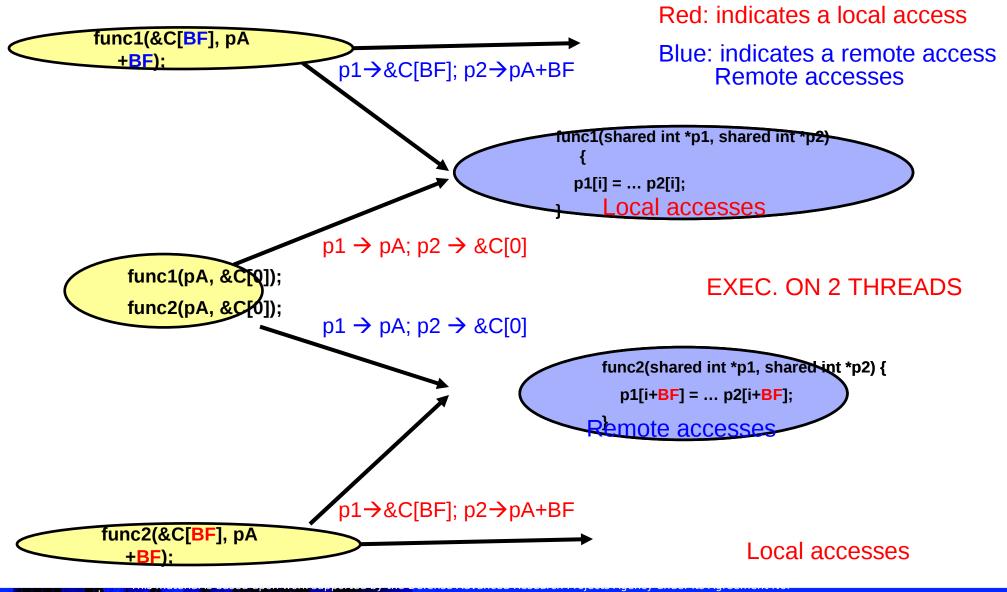


Locality Analysis for shared pointers





Possible approach: function cloning



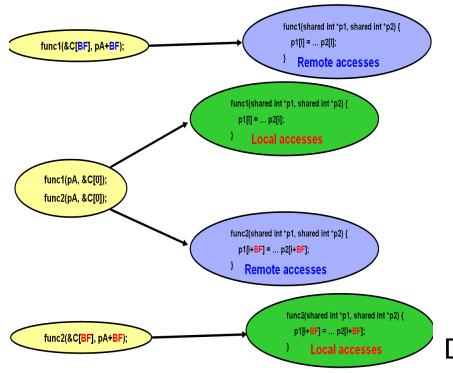
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Possible approach: function cloning



Analysis:

- Create call graph
- Label call edges with arguments
- Merge call edges with same source and target and same actual arguments
- For each edge into a node identify privatization opportunities. If opportunities exist duplicate calee nodes and adjust edges
- Label privatizable shared references in a node

Drawbacks:

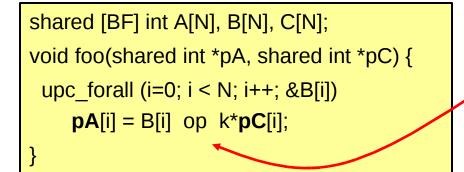
- This approach is an all program interprocedural analysis
- Potentially large code growth: entire function code is cloned

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A second approach: loop versioning

Objective: privatize pointer-to-shared dereferences



- B[i] is a shared local access
- the target of pA, pC is not known until the program executes
- How can we determine the affinity of pA, pB?

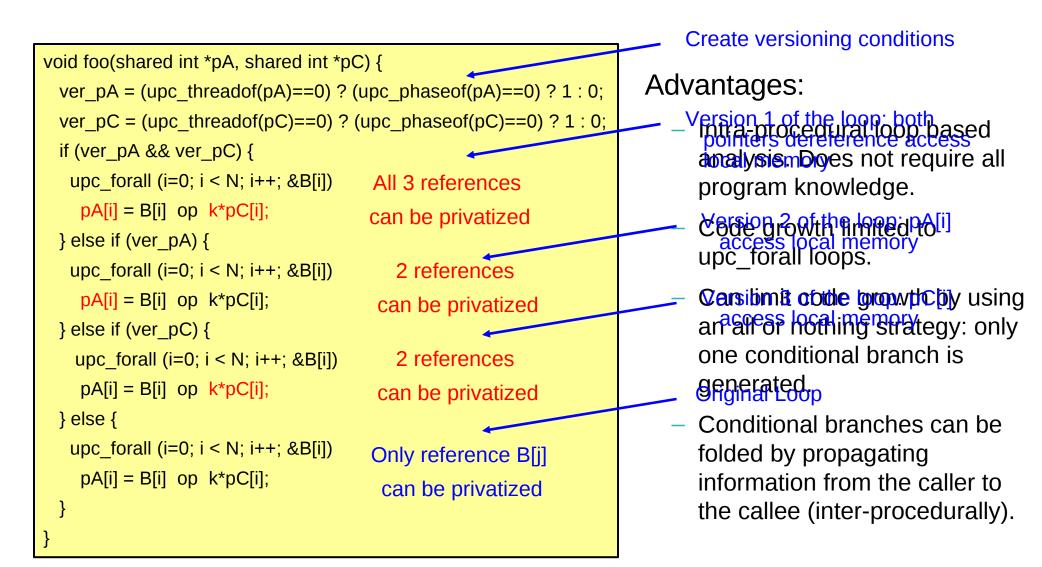
Analysis:

- gather candidate pointer dereferences in the upc_forall loops in the program
- candidate pointers must be loop invariant and have the same blocking factor as the affinity expression
- generate a copy of the original loop (version the loop)
- versioning condition uses UPC runtime calls in order to determine at runtime that pointers point to a shared array with appropriate layout

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UPC Forall Loop Versioning

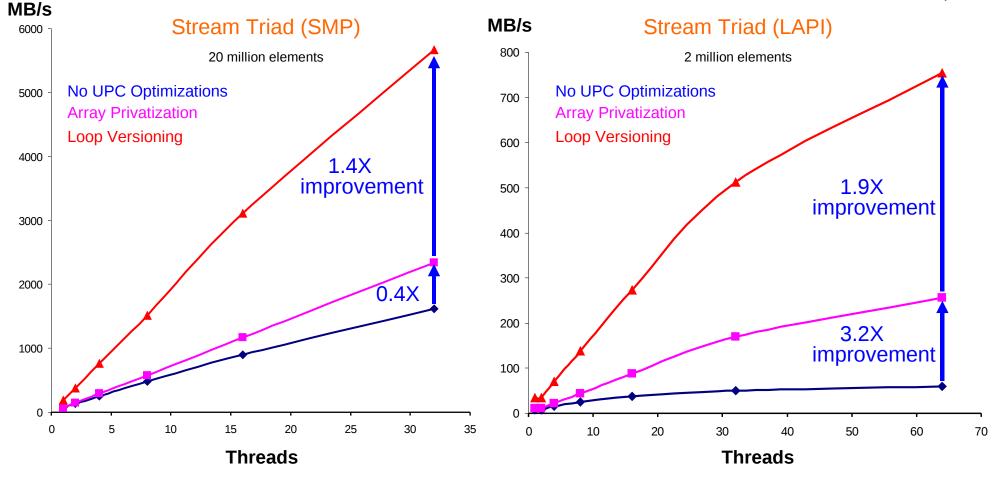


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UPC Forall Loop Versioning





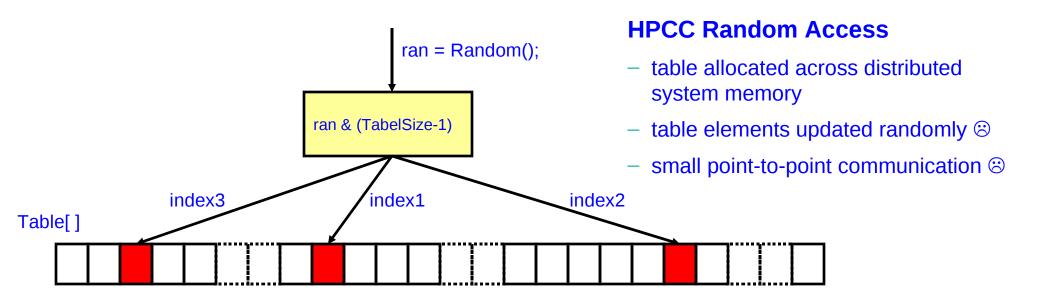
AIX 5.3, Power5, 2.3 GHz

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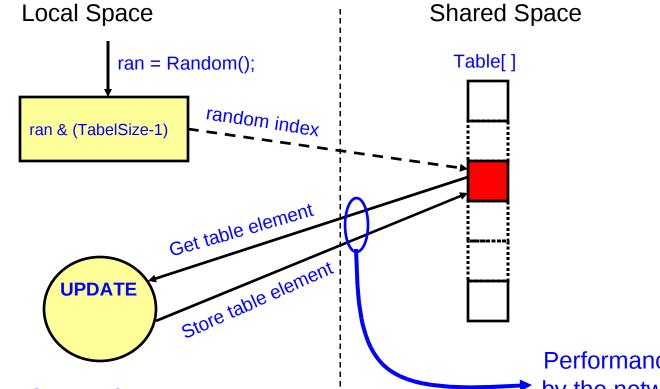
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u64Int ran = starts(NUPDATE/THREADS * MYTHREAD); upc_forall (i = 0; i < NUPDATE; i++; i) { ran = (ran << 1) ^ (((s64Int) ran < 0) ? POLY : 0); Table[ran & (TableSize-1)] ^= ran; }





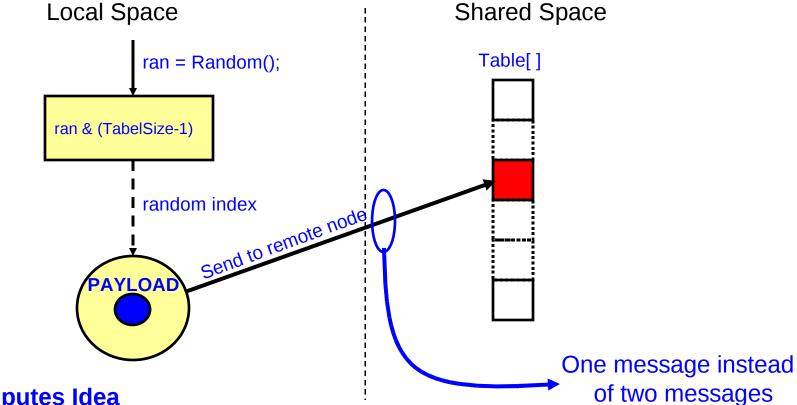


Communication in Random Access

Performance limited by the network crosssection bandwidth

- 1 fine grained messages (get) to retrieve the remote array element
- Update the array element locally
- 1 fine grained message (put) to store the updated value
- Compiler cannot predict whether the access is shared local or shared remote





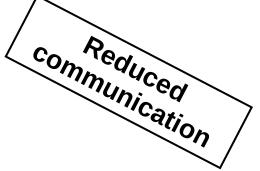
Owner computes Idea

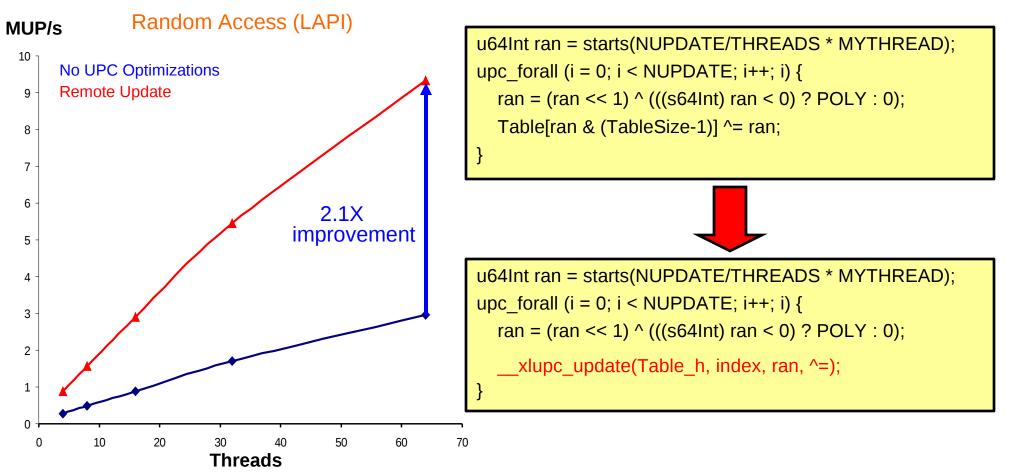
Compiler recognize update pattern and issues 1 message:

___xlupc_update(Table_h, index, ran, ^=);

- the update is now done on the **remote** node
- the communication overhead is reduced by half ☺







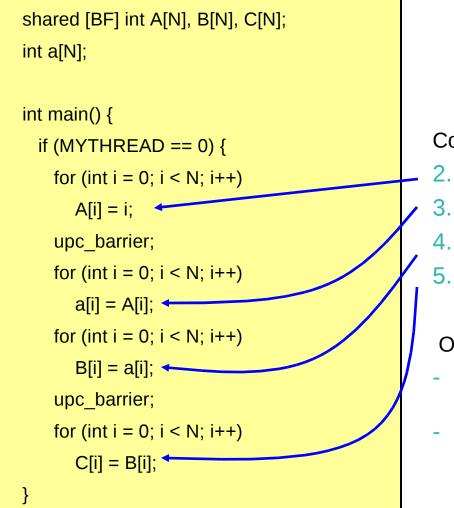
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Array Idiom Recognition



Common array initialization idioms:

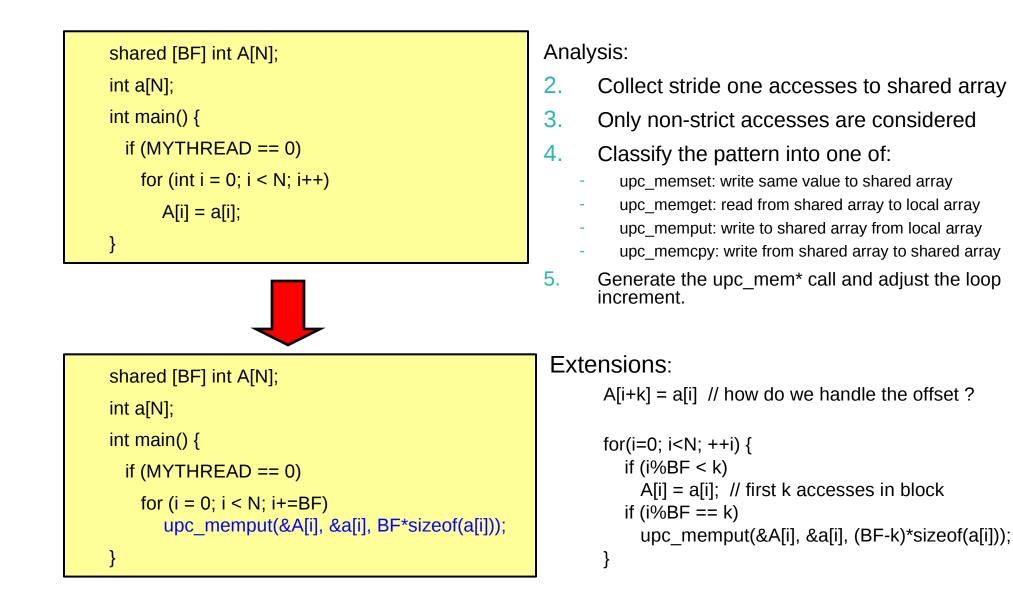
- 2. Initialize all shared array elements
- 3. Copy the shared array to a local array
- 4. Copy the local array to a second shared array
 - Copies one shared array to another shared array

Observations:

- Each operations requires fine grain communication
- How can we avoid the overhead of many small transfers to/from shared memory ?

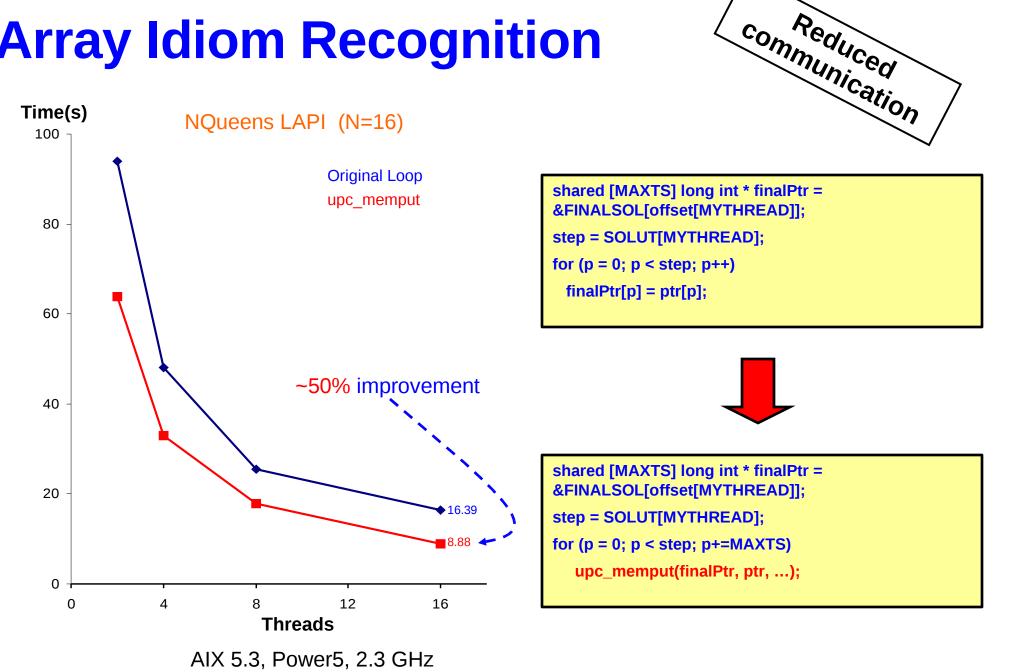


Array Idiom Recognition





Array Idiom Recognition



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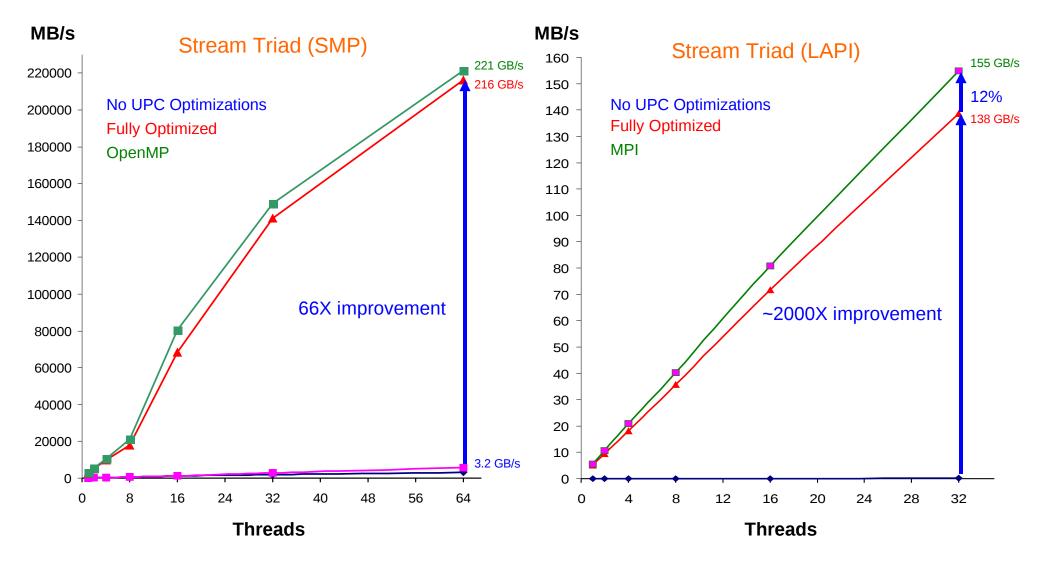


Locality Optimizations and Forall Optimizations

- Each of the optimizations presented has a reasonable impact on performance
 - Reduce overhead of accessing shared data
 - Reduce overhead of executing parallel loop
- However, when all optimizations are combined, they have a dramatic impact on performance



HPCC Stream Triad

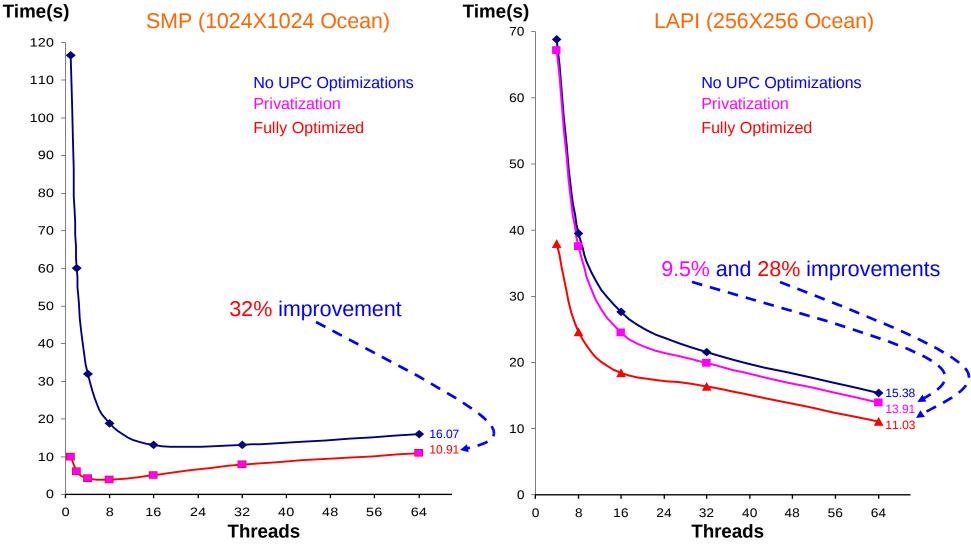


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UPC Fish - Predator-prey model



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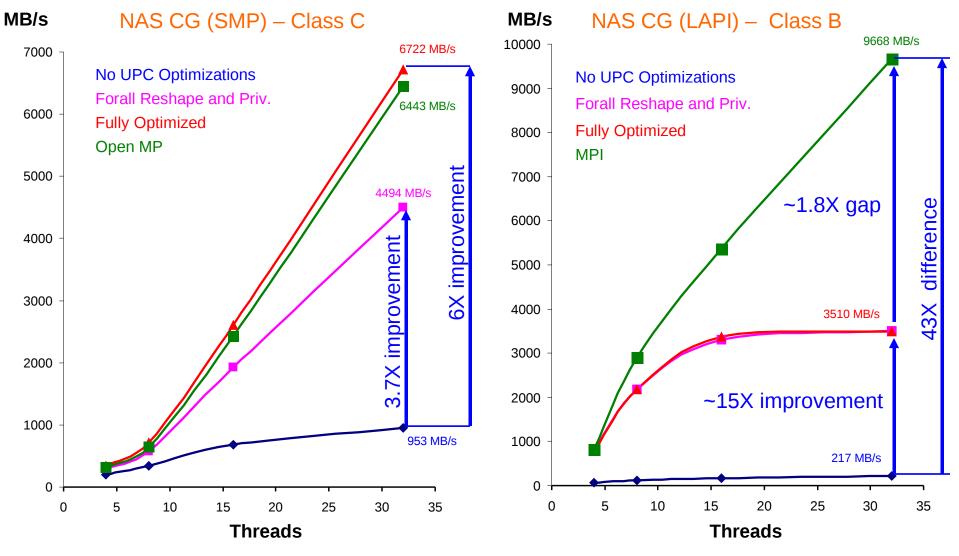
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NAS 3.2 CG – UPC vs OMP and MPI



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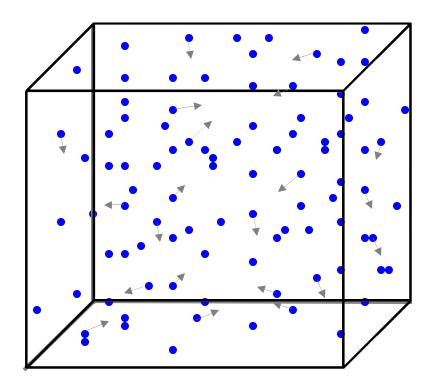
PACT 08

4. Examples of performance tuning

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- N particles in 3D space interact with each other
- Compute particles new position, velocity, acceleration at each time step



GOOD:

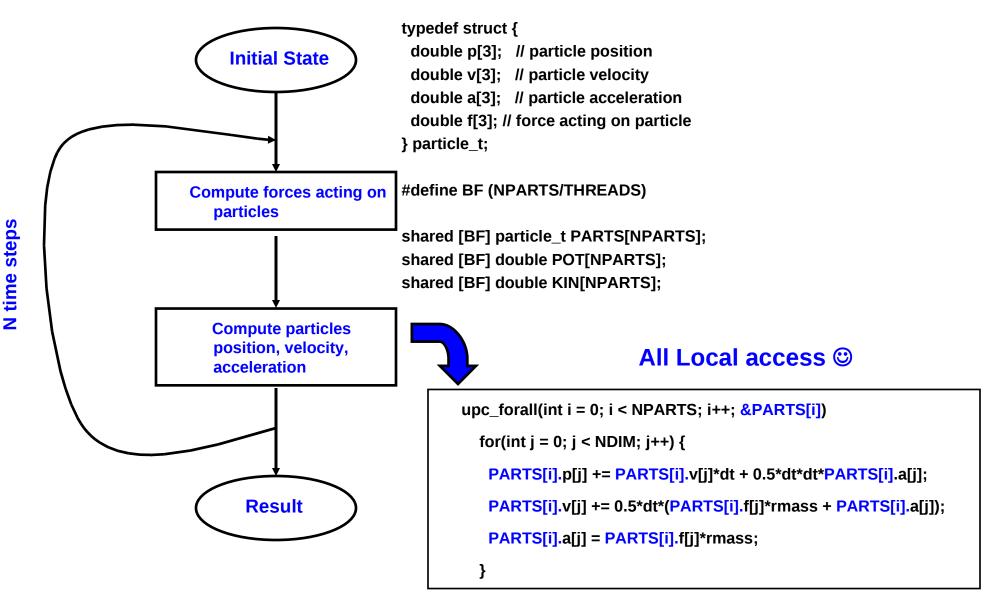
 Given force acting on each particle the computation of particles position, velocity, acceleration is an embarrassing parallel problem

BAD:

 Force acting on particle p.f[i] is a function of the gravitational attraction of all other particles ...

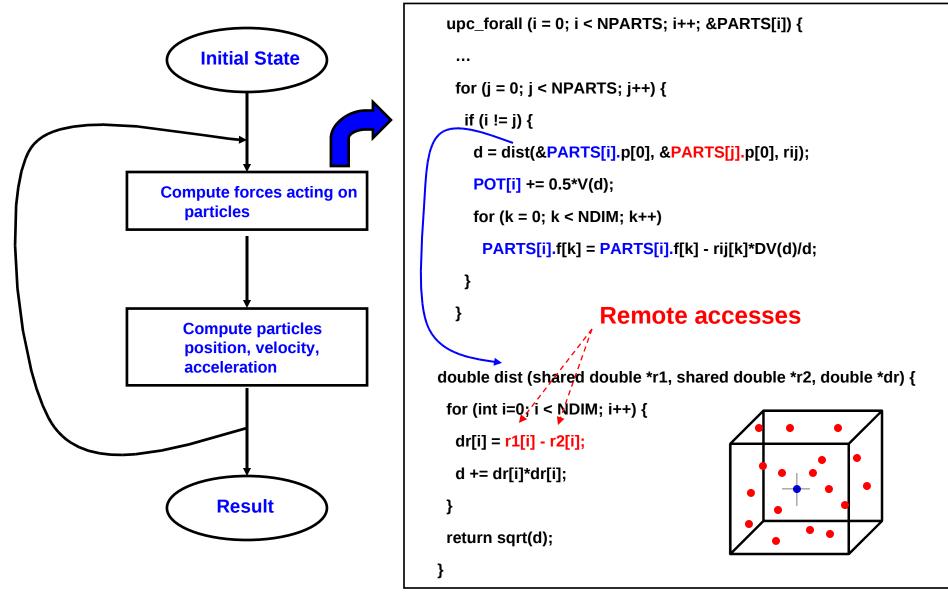
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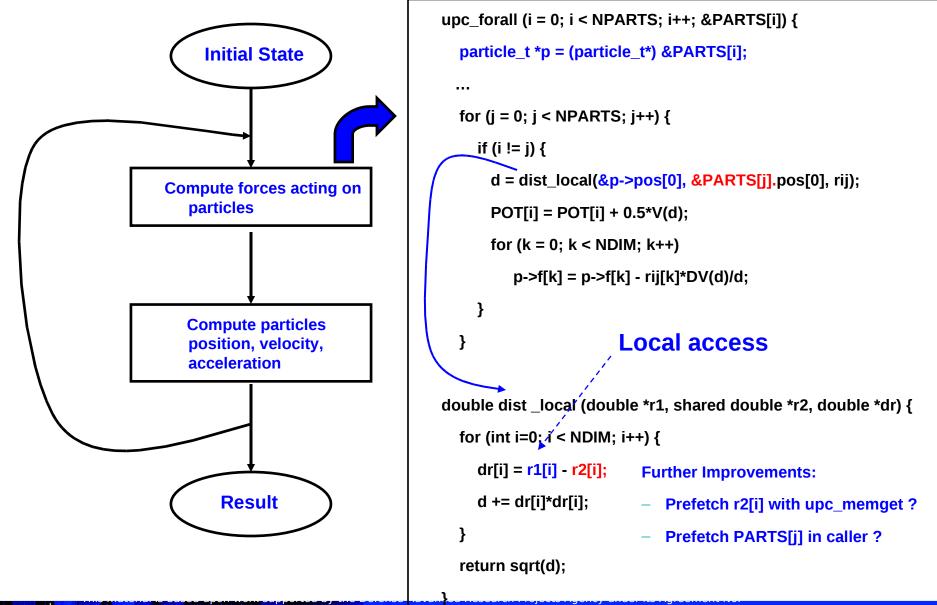




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N time steps





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N time steps



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6. Conclusions

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Conclusions



- **Exploitation of data locality**
- **Coalescing of communication**
- **Overlapping communication and** computation
- **One-sided communication**
- **Optimized collective library**

Simple syntax based on C

- Easy partitioning of shared data
- Work-sharing construct with locality information
- No explicit need to manage communication with function calls
- Simple thread synchronization

http://www.alphaworks.ibm.com/tech/upccompiler