

# Multiresolution Parallel Programming with Chapel

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University of Malaga – Department of Computer Architecture 11 September 2012



#### **Outline**



- ➤ Motivation: Programming Models
- Introducing Chapel
- Multiresolution Programming
- Empirical Evaluation
- About the Project



#### Sustained Performance Milestones



#### 1 GF – 1988: Cray Y-MP; 8 Processors

- Static finite element analysis
- Fortran77 + Cray autotasking + vectorization





#### 1 TF - 1998: Cray T3E; 1,024 Processors

- Modeling of metallic magnet atoms
- Fortran + MPI (Message Passing Interface)





#### 1 PF - 2008: Cray XT5; 150,000 Processors

- Superconductive materials
- C++/Fortran + MPI + vectorization





1 EF - ~2018: Cray \_\_\_\_; ~10,000,000 Processors

Or Perhaps Something Completely Different?

- TBD
- TBD: C/C++/Fortran + MPI + CUDA/OpenCL/OpenMP/OpenACC

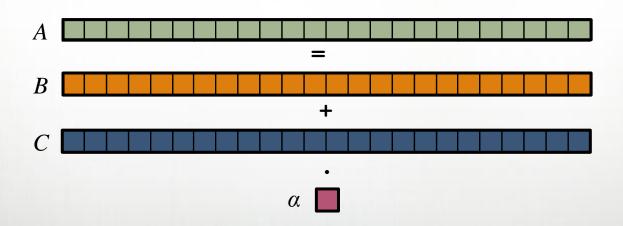




**Given:** *m*-element vectors *A*, *B*, *C* 

**Compute:**  $\forall i \in 1..m, A_i = B_i + \alpha \cdot C_i$ 

#### In pictures:



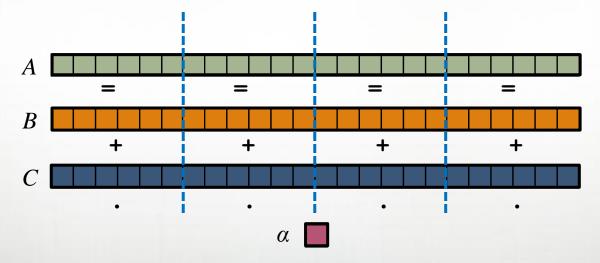




Given: m-element vectors A, B, C

**Compute:**  $\forall i \in 1..m, A_i = B_i + \alpha \cdot C_i$ 

## In pictures, in parallel:



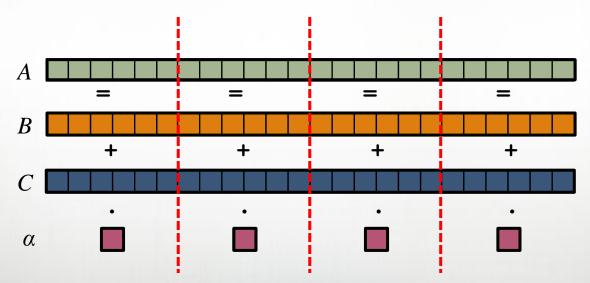




**Given:** *m*-element vectors *A*, *B*, *C* 

**Compute:**  $\forall i \in 1..m, A_i = B_i + \alpha \cdot C_i$ 

In pictures, in parallel, distributed memory:



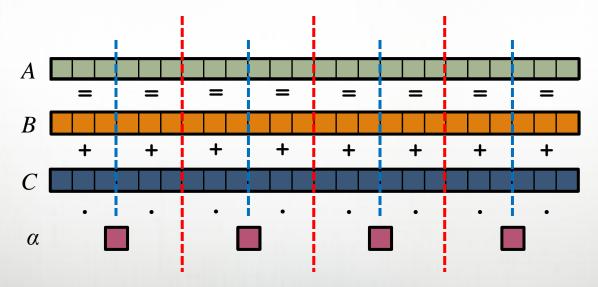




**Given:** *m*-element vectors *A*, *B*, *C* 

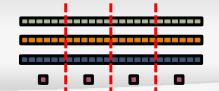
**Compute:**  $\forall i \in 1..m, A_i = B_i + \alpha \cdot C_i$ 

In pictures, in parallel, distributed memory, multicore:





#### STREAM Triad: MPI



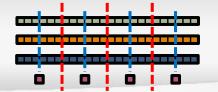


MPI

```
#include <hpcc.h>
static int VectorSize;
static double *a, *b, *c;
int HPCC StarStream(HPCC Params *params) {
  int myRank, commSize;
 int rv, errCount;
 MPI Comm comm = MPI COMM WORLD;
 MPI Comm size ( comm, &commSize );
 MPI Comm rank ( comm, &myRank );
  rv = HPCC Stream( params, 0 == myRank);
 MPI Reduce ( &rv, &errCount, 1, MPI INT, MPI SUM,
   0, comm );
  return errCount;
int HPCC Stream(HPCC Params *params, int doIO) {
  register int j;
  double scalar:
 VectorSize = HPCC LocalVectorSize( params, 3,
   sizeof(double), 0 );
  a = HPCC XMALLOC( double, VectorSize );
  b = HPCC XMALLOC( double, VectorSize );
  c = HPCC XMALLOC( double, VectorSize );
```

```
if (!a || !b || !c) {
  if (c) HPCC free(c);
  if (b) HPCC free(b);
  if (a) HPCC free(a);
  if (doIO) {
    fprintf( outFile, "Failed to allocate memory
  (%d).\n", VectorSize );
    fclose( outFile );
  return 1;
for (j=0; j<VectorSize; j++) {</pre>
 b[j] = 2.0;
  c[i] = 3.0;
scalar = 3.0;
for (j=0; j<VectorSize; j++)</pre>
  a[i] = b[i] + scalar*c[i];
HPCC free(c);
HPCC free (b);
HPCC free(a);
return 0;
```

#### STREAM Triad: MPI+OpenMP





#### MPI + OpenMP

```
#include <hpcc.h>
                                                        if (!a || !b || !c) {
#ifdef OPENMP
                                                          if (c) HPCC free(c);
#include <omp.h>
                                                          if (b) HPCC free(b);
#endif
                                                          if (a) HPCC free(a);
static int VectorSize;
                                                          if (doIO) {
static double *a, *b, *c;
                                                            fprintf( outFile, "Failed to allocate memory
                                                          (%d).\n", VectorSize );
int HPCC StarStream(HPCC Params *params) {
                                                            fclose( outFile );
  int myRank, commSize;
  int rv, errCount;
                                                          return 1;
  MPI Comm comm = MPI COMM WORLD;
 MPI Comm size ( comm, &commSize );
                                                      #ifdef OPENMP
  MPI Comm rank ( comm, &myRank );
                                                      #pragma omp parallel for
                                                      #endif
  rv = HPCC Stream( params, 0 == myRank);
                                                        for (j=0; j<VectorSize; j++) {</pre>
  MPI Reduce ( &rv, &errCount, 1, MPI INT, MPI SUM,
                                                         b[j] = 2.0;
   0, comm );
                                                          c[i] = 3.0;
  return errCount;
                                                        scalar = 3.0;
int HPCC Stream(HPCC Params *params, int doIO) {
                                                      #ifdef OPENMP
  register int j;
                                                      #pragma omp parallel for
  double scalar:
                                                      #endif
                                                        for (j=0; j<VectorSize; j++)</pre>
  VectorSize = HPCC LocalVectorSize( params, 3,
                                                          a[i] = b[i] + scalar * c[i];
   sizeof(double), 0 );
                                                        HPCC free(c);
  a = HPCC XMALLOC( double, VectorSize );
                                                        HPCC free (b);
  b = HPCC XMALLOC ( double, VectorSize );
                                                        HPCC free(a);
  c = HPCC XMALLOC( double, VectorSize );
                                                        return 0;
```



#### STREAM Triad: MPI+OpenMP vs. CUDA

#### MPI + OpenMP

scalar = 3.0;
#ifdef OPENMP

HPCC free(c);

HPCC\_free(b);
HPCC\_free(a);

#pragma omp parallel for

a[j] = b[j] + scalar\*c[j];

```
#include <hpcc.h>
#ifdef OPENMP
#include <omp.h>
#endif
static int VectorSize;
static double *a, *b, *c;
int HPCC StarStream(HPCC Params *params)
 int myRank, commSize;
 int rv, errCount;
 MPI Comm comm = MPI COMM WORLD;
 MPI Comm size ( comm, &commSize );
 MPI Comm_rank( comm, &myRank );
 rv = HPCC Stream( params, 0 == myRank);
 MPI Reduce ( &rv, &errCount, 1, MPI INT, MPI SUM, 0, comm );
int HPCC_Stream(HPCC_Params *params, int doIO) {
 register int i:
 double scalar;
 VectorSize = HPCC LocalVectorSize(
 a = HPCC XMALLOC ( double, VectorSiz
 b = HPCC XMALLOC ( double, VectorSiz
 c = HPCC XMALLOC( double, VectorSi
 if (!a || !b || !c) {
   if (c) HPCC free(c);
   if (b) HPCC free(b);
   if (a) HPCC_free(a);
   if (doIO) {
      fprintf( outFile, "Failed to allocate memory (%d).\n", VectorSize );
      fclose( outFile );
    return 1;
#ifdef OPENMP
#pragma omp parallel for
#endif
 for (j=0; j<VectorSize; j++) {
  b[j] = 2.0;
   c[j] = 3.0;
```

#### **CUDA**

```
#define N 2000000
int main() {
  float *d_a, *d_b, *d_c;
  float scalar;

cudaMalloc((void**)&d_a, sizeof(float)*N);
  cudaMalloc((void**)&d_b, sizeof(float)*N);
  cudaMalloc((void**)&d_c, sizeof(float)*N);

dim3 dimBlock(128);
  dim3 dimBlock(128);
  dim3 dimGrid(N/dimBlock.x );
  if( N % dimBlock.x != 0 ) dimGrid.x+=1;

ck>>>(d_b, 2.0f, N);
  ck>>>(d_c, 3.0f, N);
```

#### Where is programmer productivity ??



# By Analogy: Let's Cross the United States!







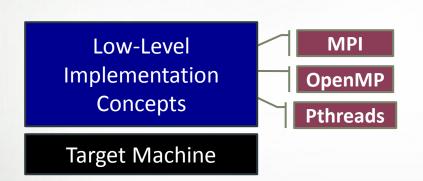
# By Analogy: Let's Cross the United States!







#### Multiresolution Design: Motivation



"Why is everything so tedious/difficult?"

"Why don't my programs port trivially?"



**Target Machine** 

"Why don't I have more control?"



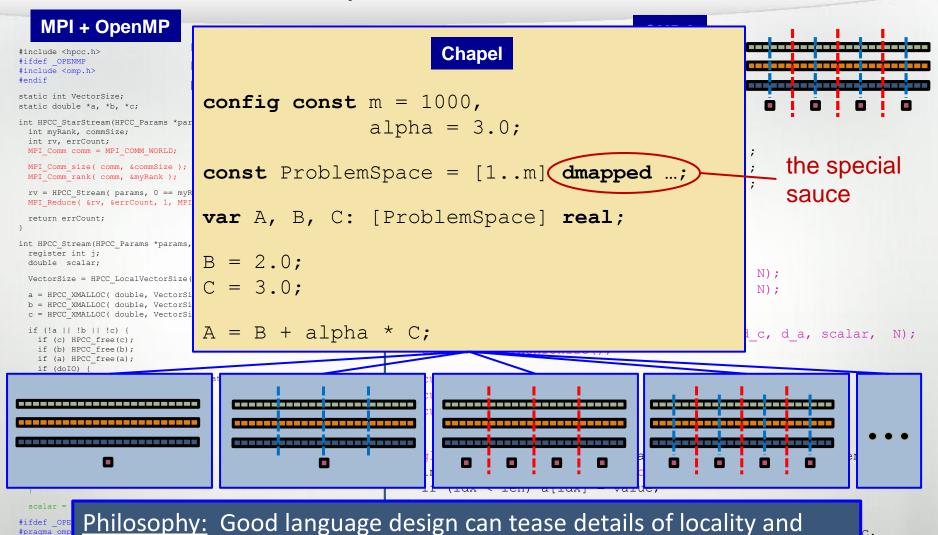


#### STREAM Triad: MPI+OpenMP vs. CUDA

#endif

CHAPEL

a[j] = HPCC free



parallelism away from an algorithm, permitting the compiler, runtime,

applied scientist, and HPC expert each to focus on their strengths.

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#### Chapel in a Nutshell



#### Chapel: a parallel language that has emerged from DARPA HPCS

- general parallelism:
  - data-, task-, and nested parallelism
  - highly dynamic multithreading or static SPMD-style
- locality control:
  - explicit or data-driven placement of data and tasks
  - locality expressed distinctly from parallelism
- multiresolution philosophy: high-level features built on low-level
  - to provide "manual overrides"
  - to support a separation of concerns (application vs. parallel experts)
- features for productivity: type inference, iterators, rich array types
- portable: designed and implemented to support diverse systems
- open source: developed and distributed under the BSD license
- plausibly adoptable: forward-thinking HPC users want a mature version





# Static Type Inference

```
name = "vass";  // name is a string
var sum = add(1, pi), // sum is a real
   email = add(name, "@cray");  // email is a string
for i in 1..5 {
 if i == 2 { writeln(sum, " ", email); }
proc add(x, y) {      // add() is generic
 return x + y; // its return type is inferred
```

#### 4.14 vass@cray





#### Static Type Inference

```
name = "vass";  // name is a string
var sum = add(1, pi), // sum is a real
   email = add(name, "@cray"); // email is a string
for i in 1..5 {
 if i == 2 { writeln(sum, " ", email); }
proc add(x:int, y:real):real {     // or, explicit typing
                        // return expr is checked
 return x + y;
proc add(x:string, y:string) {    // need another overload
 return x + y; // return type is inferred here
```

#### 4.14 vass@cray



#### **Iterators**



```
iter fibonacci(n) {
  var current = 0,
    next = 1;
  for 1..n {
    yield current;
    current += next;
    current <=> next;
  }
}
```

```
for f in fibonacci(7) do
  writeln(f);
```

```
0
1
1
2
3
5
```







```
coforall t in 0..#numTasks {
  writeln("Hello from task ", t, " of ", numTasks);
}
writeln("All tasks done");
```

```
Hello from task 2 of 4
Hello from task 0 of 4
Hello from task 3 of 4
Hello from task 1 of 4
All tasks done
```







```
writeln("on locale 0");

on Locales[1] do
    writeln("now on locale ", here.id);

writeln("on locale 0 again");
```

```
on locale 0
now on locale 1
on locale 0 again
```



#### **Outline**

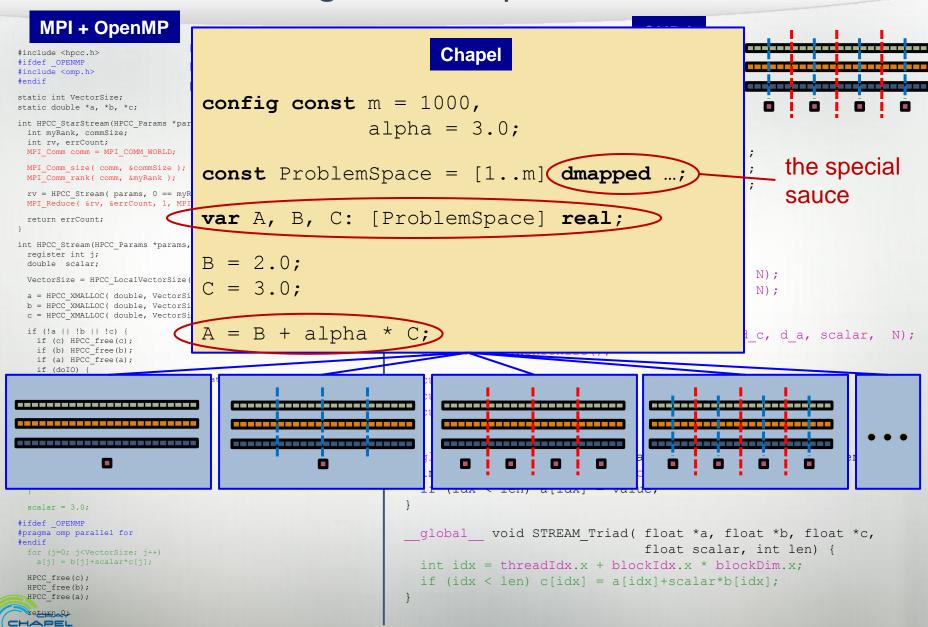


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#### Multiresolution Design: an Example



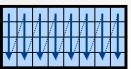
# Data Parallelism Implementation Qs

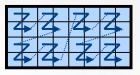


#### Q1: How are arrays laid out in memory?

Are dense arrays laid out in row- or column-major order? Or...?







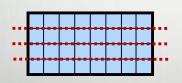


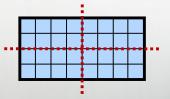
?

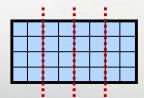
How are sparse arrays stored? (COO, CSR, CSC, block-structured, ...?)

# Q2: How are arrays stored by the locales?

- Completely local to one locale? Or distributed?
- If distributed... In a blocked manner? cyclically? block-cyclically? recursively bisected? dynamically rebalanced? ...?









..?

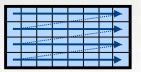


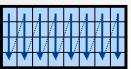
# Data Parallelism Implementation Qs

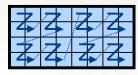


#### Q1: How are arrays laid out in memory?

Are regular arrays laid out in row- or column-major order? Or...?









...?

How are sparse arrays stored? (COO, CSR, CSC, block-structured, ...?)

#### Q2: How are arrays stored by the locales?

- Completely local to one locale? Or distributed?
- If distributed... In a blocked manner? cyclically? block-cyclically? recursively bisected? dynamically rebalanced? ...?

# A: Chapel's domain maps are designed to give the user full control over such decisions

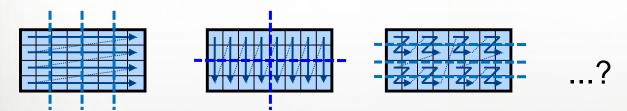




### More Data Parallelism Implementation Qs

#### Q: How are loops implemented?

- How many tasks? Where do they execute?
- How is the iteration space divided between the tasks?
  - statically? dynamically? what algorithm?



A: Chapel's domain maps are designed to give the user full control here, too



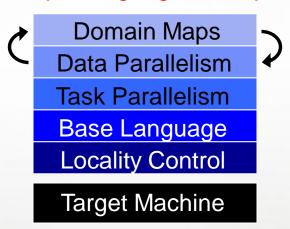


#### Multiresolution Design: Implementation

### Multiresolution Design: Support multiple tiers of features

- higher levels for programmability, productivity
- lower levels for greater degrees of control

#### Chapel language concepts

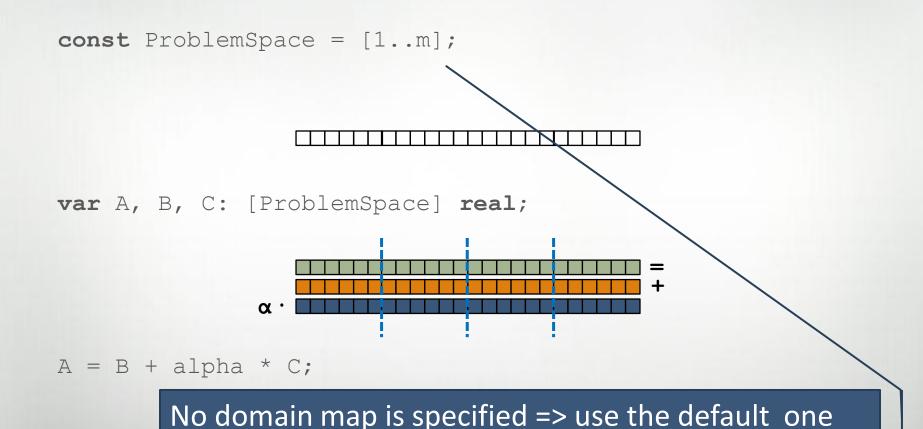


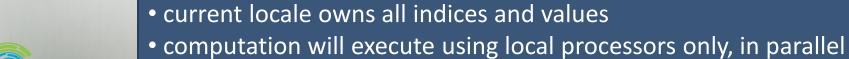
- build the higher-level concepts in terms of the lower
- permit the user to intermix layers arbitrarily





# STREAM Triad: Chapel (multicore)

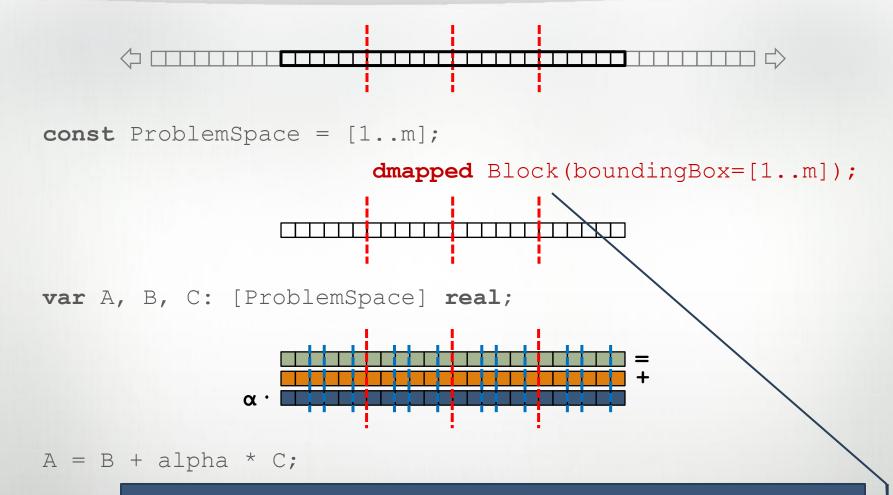








### STREAM Triad: Chapel (multilocale, blocked)



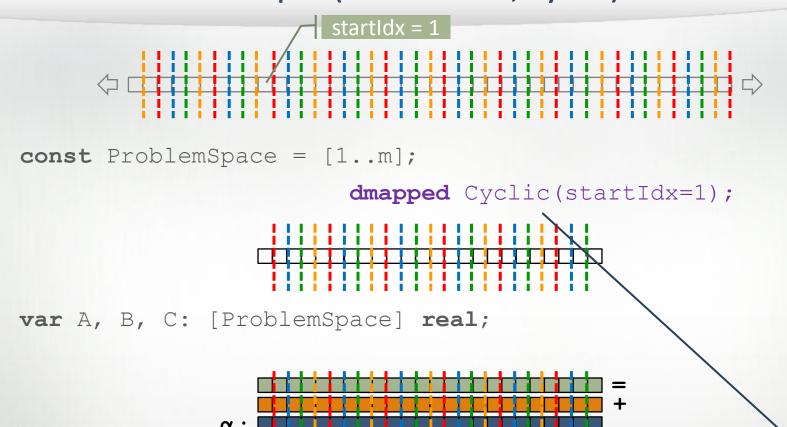
#### Block domain map is chosen explicitly

- indices and values are distributed over all locales
- computation will execute on all locales and processors, in parallel





#### STREAM Triad: Chapel (multilocale, cyclic)



$$A = B + alpha * C;$$

#### Cyclic domain map is chosen explicitly

• similarly, distributed values, distributed+parallel computation





# Chapel's Domain Map Philosophy

Domain maps are "recipes" that instruct the compiler how to implement global-view computations

- Unless requested explicitly, a reasonable default domain map/ implementation is used
- Chapel provides a library of standard domain maps
  - to support common array implementations effortlessly
- Advanced users can write their own domain maps in Chapel
  - to cope with shortcomings in the standard library
  - using Chapel all of the language is fully available

switching to lower resolution for more control

• not required, but available when desired





#### Domain Maps: Some Details

Given an implicit loop...

```
A = B + alpha * C;
```

- or an equivalent explicit loop
  - forall indicates it is parallel

```
forall (a,b,c) in (A,B,C) {
   a = b + alpha * c; }
```

the compiler converts it to

Chapel's <u>iterator</u> – here enables user to introduce distribution and parallelism

"leader/follower" scheme (not in this talk)

pseudocode

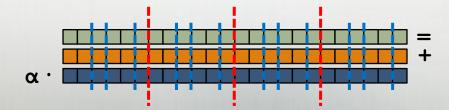




### Domain Maps: The User Can

• ... and the author of MyDomainMap implements these iterators, for example:

```
iter MyDomainMap.these(...) {
   coforall loc in Locales {
      on loc {
      coforall task in 1..here.numCores {
         yield computeMyChunk(loc.id, task);
      }
   }
}
```







#### For More Information on Domain Maps

HotPAR'10: User-Defined Distributions and Layouts in Chapel:

Philosophy and Framework

Chamberlain, Deitz, Iten, Choi; June 2010

CUG 2011: Authoring User-Defined Domain Maps in Chapel Chamberlain, Choi, Deitz, Iten, Litvinov; May 2011

#### **Chapel release:**

- Technical notes detailing domain map interface for programmers:
   \$CHPL\_HOME/doc/technotes/README.dsi
- Current domain maps:

```
$CHPL_HOME/modules/dists/*.chpl
layouts/*.chpl
internal/Default*.chpl
```





#### For More Information on Leader-Follower Iterators

**PGAS 2011:** User-Defined Parallel Zippered Iterators in Chapel, Chamberlain, Choi, Deitz, Navarro; October 2011

#### **Chapel release:**

- Primer example introducing leader-follower iterators:
  - examples/primers/leaderfollower.chpl
- Library of dynamic leader-follower range iterators:
  - AdvancedIters chapter of language specification





#### Multiresolution Design: Summary

- Chapel avoids locking crucial implementation decisions into the language specification
  - local and distributed array implementations
  - parallel loop implementations
- Instead, these can be...
  - ... specified in the language by an advanced user
  - ...swapped in and out with minimal code changes
- The result cleanly separates the roles of domain scientist, parallel programmer, and implementation



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### **User-Defined Parallel Iterators**



**PGAS 2011:** *User-Defined Parallel Zippered Iterators in Chapel,* Chamberlain, Choi, Deitz, Navarro; October 2011

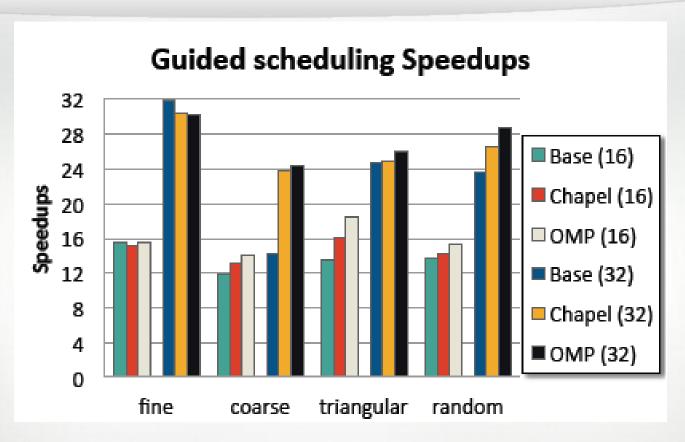
- Implemented various scheduling policies
  - OpenMP-style dynamic and guided
  - adaptative, with work stealing
  - available as iterators
- Compared performance against OpenMP
  - Chapel is competitive

Chapel's multi-resolution design allows HPC experts to implement desired policies and scientists to incorporate them with minimal code changes



# Chapel vs. OpenMP Guided





#### synthetic workloads:

- fine: 1 μsec × 1mln iters
- coarse: 0.1sec × 100 iters

speedup=1 => sequential C code

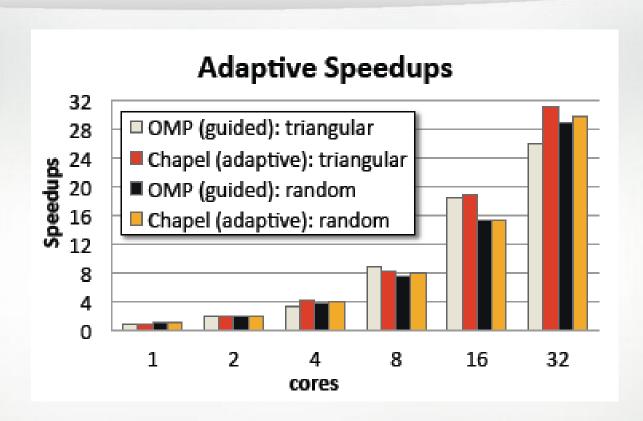
- triangular: 100\*i μsec × i=1000...1
- random: 0.1\*rand() sec × 1000 iters

Base => Chapel's default iterator





# Chapel Adaptive vs. OpenMP Guided



#### adaptive work stealing:

- scales better to more cores
  - distributed splitting reduces contention
- lowers the cost of splitting



# **Targetting GPUs**



IPDPS 2012: Performance Portability with the Chapel Language,
Sidelnik, Maleki, Chamberlain, Garzarán, Padua; May 2012

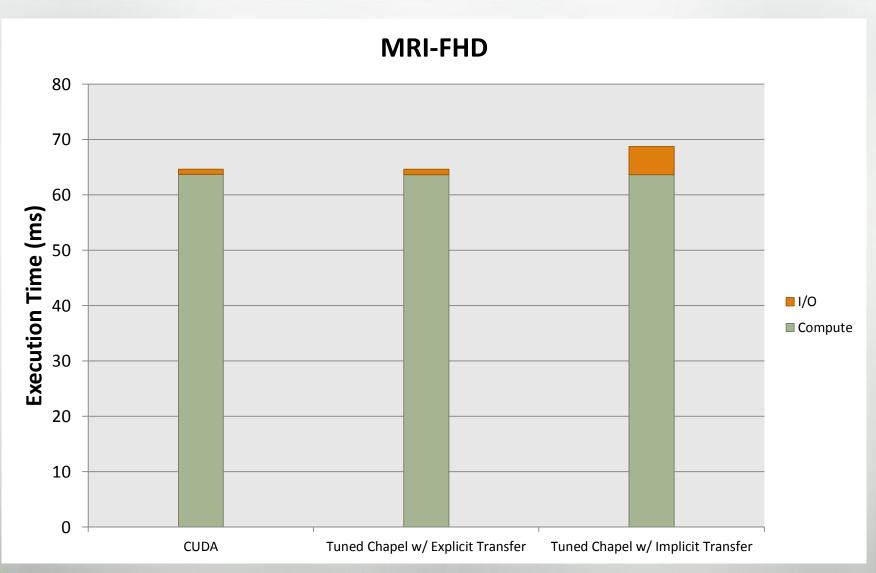
- Technology for running Chapel code on GPUs
  - implemented a domain map to place data and execute code on GPUs
  - added compiler support to emit CUDA code; additional optimizations
- Compared performance against hand-coded CUDA
  - competitive performance, less code

The domain map allows the user to target GPUs with minimal code changes





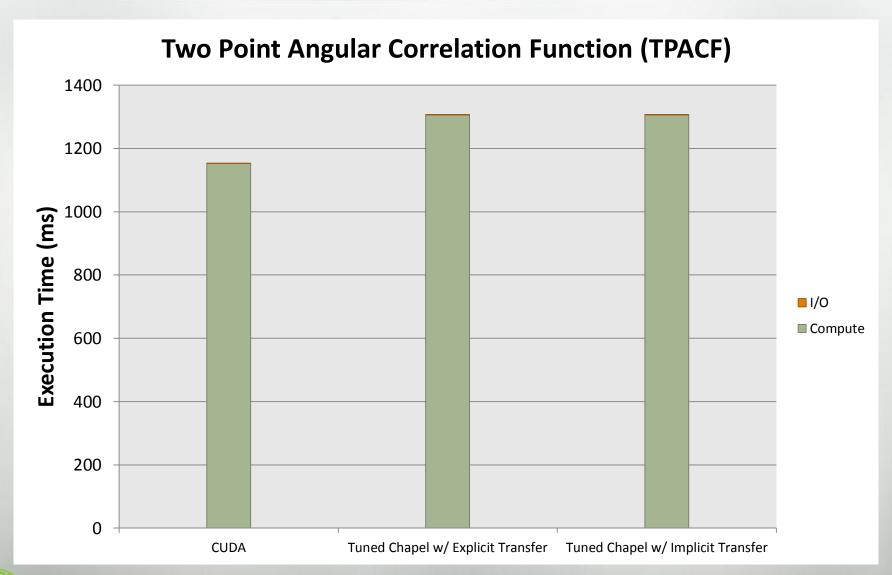
# Parboil Benchmark Suite















# Code Size Comparison

Benchmark	# Lines (CUDA)	# Lines (Chapel)	% difference	# of Kernels
СР	186	154	17	1
MRI-FHD	285	145	49	2
MRI-Q	250	125	50	2
RPES	633	504	16	2
TPACF	329	209	36	1





# **Aggregate Communication Optimization**

SBAC-PAD 2012: Global Data Re-Allocation via Communication Aggregation,
Sanz, Asenjo, López, Larrosa, Navarro, et al.; October 2012

- Reduced #messages for Chapel array assignments
  - from 1 per array element
  - to 1 per (source, destination) locale pair
  - for default, Block and Cyclic domain maps

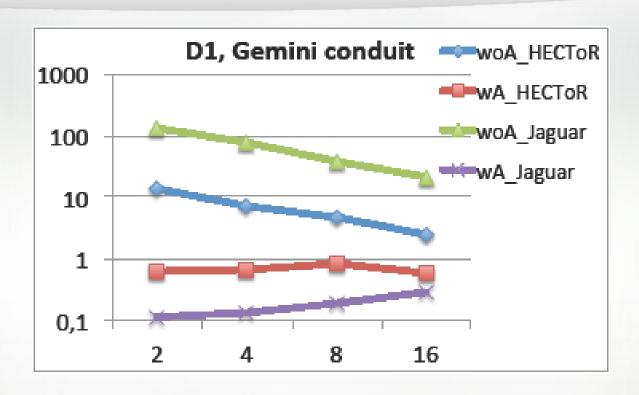
Chapel's multi-resolution design allowed almost all of this optimization to be implemented at the Chapel source code level

simple GASNet adaptors were written in C





# Array assignment, with/without aggregation



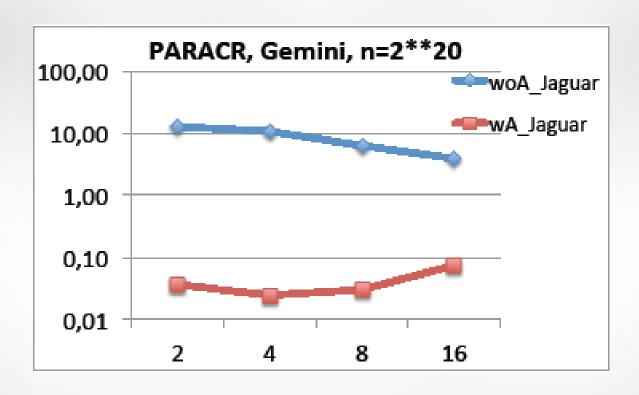
When #locales increases – #messages per locale...

- without aggregation => decreases
- with aggregation => increases
- asymptotically (constant #elements, large #locales)=> similar #messages





# PARACAR – Block-to-Cyclic redistribution



PARACAR is implemented in Chapel with arrays Block-distributed during earlier phases and Cyclic-distributed during later phases



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# Chapel's Implementation



- Being developed as open source at SourceForge
  - BSD license

## Target Architectures:

- Cray architectures
- multicore desktops and laptops
- commodity clusters
- systems from other vendors
- in-progress: CPU+accelerator hybrids, manycore, ...
- Try it out and give us feedback!





### Implementation Status – Version 1.5 (April 2012)

### In a nutshell:

- Most features work at a functional level
- Many performance optimizations remain
  - current team focus

## This is a good time to:

- Try out the language and compiler
- Use Chapel for non-performance-critical projects
- Give us feedback to improve Chapel
- Use Chapel for parallel programming education



# Some Next Steps



- Hierarchical Locales
- Resilience Features
- Performance Optimizations
- Evolve from Prototype- to Production-grade
- Evolve from Cray- to community-language
- and much more...





# Collaborations (see <a href="mailto:chapel.cray.com/collaborations.html">chapel.cray.com/collaborations.html</a> for details)

#### Bulk-Copy Optimization

- Rafael Asenjo et al. University of Málaga
- reduce inter-node communication time
- paper at SBAC-PAD, Oct 2012

#### Dynamic Iterators

- Angeles Navarro et al. University of Málaga
- better dynamic and adaptive loop scheduling
- paper at PGAS, Oct 2011

#### Parallel File I/O

- Rafael Larrosa et al. University of Málaga
- speed up I/O of distributed arrays
- paper at ParCo, Aug 2011

#### Tasking using Nanos++

- Alejandro Duran BSC/UPC
- lightweight task switching





## Collaborations, continued

- Tasking using Qthreads: Sandia (Rich Murphy, Kyle Wheeler, Dylan Stark)
  - paper at CUG, May 2011
- Interoperability using Babel/BRAID: LLNL (Tom Epperly, Adrian Prantl, et al.)
  - paper at PGAS, Oct 2011
- Improved I/O & Data Channels: LTS (Michael Ferguson)
- LLVM back-end: LTS (Michael Ferguson)
- CPU-GPU Computing: UIUC (David Padua, Albert Sidelnik, Maria Garzarán)
  - paper at IPDPS, May 2012
- Interfaces/Generics/OOP: CU Boulder (Jeremy Siek, Jonathan Turner)
- Tuning/Portability/Enhancements: ORNL (Matt Baker, Jeff Kuehn, Steve Poole)
- Chapel-MPI Compatibility: Argonne (Rusty Lusk, Pavan Balaji, Jim Dinan, et al.)



### For More Information



# Chapel project page: <a href="http://chapel.cray.com">http://chapel.cray.com</a>

overview, papers, presentations, language spec, ...

## Chapel SourceForge page: <a href="https://sourceforge.net/projects/chapel/">https://sourceforge.net/projects/chapel/</a>

release downloads, public mailing lists, code repository, ...

# **Mailing Lists:**

- chapel\_info@cray.com: contact the team
- chapel-users@lists.sourceforge.net: user-oriented discussion list
- chapel-developers@lists.sourceforge.net: dev.-oriented discussion
- chapel-education@lists.sourceforge.net: educator-oriented discussion
- chapel-bugs@lists.sourceforge.net: public bug forum
- chapel\_bugs@cray.com: private bug mailing list



