# UPC and UPC++: Partitioned Global Address Space Languages

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Science



### Parallel Programming Problem: Histogram

- Consider the problem of computing a histogram:
  - -Large number of "words" streaming in from somewhere
  - -You want to count the # of words with a given property
- In shared memory
  - -Lock each bucket



- Distributed memory: the array is huge and spread out
  - -Each processor has a substream and sends +1 to the appropriate processor... and that processor "receives"







## **Goals of PGAS Programming**

- Applications: convenient programming of irregular codes
  - -Graphs
  - -Hash tables
  - -Sparse matrices
  - -Adaptive (hierarchical) meshes
- Machines: expose best available performance on a given machine
  - -Low latency for small messages
  - -High bandwidth even for medium sized messages
  - -High injection bandwidth





#### **PGAS = Partitioned Global Address Space**

- Global address space: thread may directly read/write remote data
  - Convenience of shared memory
- Partitioned: data is designated as local or global
  - Locality and scalability of message passing





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#### Hello World in UPC

- Any legal C program is also a legal UPC program
- If you compile and run it as UPC with P threads, it will run P copies of the program.
- Using this fact, plus a few UPC keywords:

```
#include <upc.h> /* needed for UPC extensions */
#include <stdio.h>
main() {
    printf("Thread %d of %d: hello UPC world\n",
        MYTHREAD, THREADS);
```





#### PGAS means directly accessing remote data

- SPMD: fixed number of threads (e.g., one per core)
- Distributed arrays are built-in shared int a[100]; // shared array
  a[10] = 3; // put, possibly remote
  int x = a[14]; // get, possibly remote
- UPC has locks and barriers for synchronization and collective communication (broadcast, reduce, etc.)





#### Partitioned Global Address Space (review)



- Directly read/write remote memory; partitioned for locality
- One-sided communication underneath:

Put:  $a[i] = ...; *p = ...; upc_mem_get(..)$ Get: ... =  $a[i]...; ... = *p; ____upc_mem_put(...)$ 



**Important for performance:** 

- Communication overlap with computation
- Communication overlap with communication (pipelining)
- Low overhead communication

```
#include<upc_nb.h>
```





### **One-Sided Communication in PGAS (e.g., GASnet inside)**



- A two-sided message needs to be matched with a receive
  - Ordering requirements on messages can also hinder bandwidth
- A one-sided put/get message can be handled directly by a network interface with RDMA support
  - Decouples transfer from synchronization
  - Avoids interrupting the CPU or storing data from CPU (preposts)





#### Latency on a Cray Aries (NERSC Cori-P1)







#### **Bandwidth on a Cray Aries (NERSC Cori-P1)**







#### Medium sized "flood" bandwidth across machine







# **Application Challenge: Fast All-to-All**



#### **Bisection Bandwidth**



- Avoid congestion at node interface: allow all cores to communicate
- Avoid congestion inside global network: spread communication over longer time period (send early and often)





# **FFT Performance on BlueGene/P (Mira)**

**UPC** implementation 3500 outperforms MPI Slabs 3000 Slabs (Collective) Packed Slabs (Collective) Both use highly 2500 → MPI Packed Slabs optimized FFT library on each node GFlops 2000 **UPC version avoids** 1500 send/receive synchronization 1000 G Lower overhead 500 Better overlap 0 **Better bisection** 256 512 1024 2048 4096 8192 16384 32768 bandwidth Num. of Cores



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#### **De novo Genome Assembly**

- DNA sequence consists of 4 bases: A/C/G/T
- Read: short fragment of DNA
- **De novo assembly: Construct a** genome (chromosomes) from a collection of reads









## **PGAS in Genome Assembly**

- Sequencers produce fragments called "reads"
- Chop them into overlap fixed-length fragments, "K-mers"
- Parallel DFS (from randomly selected K-mers)  $\rightarrow$  "contigs"



- Hash tables used here (and in other assembly phases)
   Different use cases, different implementations
- Some tricky synchronization to deal with conflicts





#### **Partitioned Global Address Space Programming**



- Store the connections between read fragments (K-mers) in a hash table
- Allows for TB-PB size data sets





#### **HipMer (High Performance Meraculous) Assembly Pipeline**

### **Distributed Hash Tables in PGAS**

- Remote Atomics, Dynamic Aggregation, Software Caching
- 13x Faster than MPI code (Ray) on 960 cores



Evangelos Georganas, Aydın Buluç, Jarrod Chapman, Steven Hofmeyr, Chaitanya Aluru, Rob Egan, Lenny Oliker, Dan Rokhsar, and Kathy Yelick. HipMer: An Extreme-Scale De Novo Genome Assembler, SC'15



#### **Comparison to other Assemblers**



### **Science Impact: HipMer is transformative**

- Human genome (3Gbp) "de novo" assembled :
  - -Meraculous: 48 hours
  - -HipMer: 4 minutes (720x speedup relative to Meraculous)

Makes unsolvable problems solvable!

- Wheat genome (17 Gbp) "de novo" assembled (2014):
  - -Meraculous (did not run):
  - -HipMer: 39 minutes; 15K cores (first all-in-one assembly)
- Pine genome (20 Gbp) "de novo" assembled (2014) :
  - -Masurca : 3 months; 1 TB RAM
- Wetland metagenome (1.25 Tbp) analysis (2015):
  - -Meraculous (projected): 15 TB of memory
  - -HipMER: Strong scaling to over 100K cores (contig gen only)

Georganas, Buluc, Chapman, Oliker, Rokhsar, Yelick, [Aluru,Egan,Hofmeyr] in SC14, IPDPS15, SC15







DEGAS



### **UPC++: PGAS with "Mixins"**

UPC++ uses templates (no compiler needed)

shared\_var<int> s;
global\_ptr<LLNode> g;
shared\_array<int> sa(8);

DEGAS

- Default execution model is SPMD, but
- Remote procedure calls, async
   async(place) (Function f, T1 arg1,...);
   wait(); // other side does poll();





- Teams for hierarchical algorithms and machines teamsplit (team) { ... }
- Interoperability is key; UPC++ can be use with OpenMP or MPI



## **UPC++ Performance Close to UPC**

# UPC++ is a library, not a compiled language, yet performance is comparable



# **Application Challenge: Data Fusion in UPC++**

- Seismic modeling for energy applications "fuses" observational data into simulation
- With UPC++ "matrix assembly" can solve larger problems



First ever sharp, three-dimensional scan of Earth's interior that conclusively connects plumes of hot rock rising through the mantle with surface hotspots that generate volcanic island chains like Hawaii, Samoa and Iceland.



French and Romanowicz use code with UPC++ phase to compute *first ever* whole-mantle global tomographic model using numerical seismic wavefield computations (F & R, 2014, GJI, extending F et al., 2013, Scien24).



# **Application Challenge: Data Fusion in UPC++**



#### **Distributed Matrix Assembly**

- Remote asyncs with user-controlled resource management
- Remote memory allocation
- Team idea to divide threads into injectors / updaters
- 6x faster than MPI 3.0 on 1K nodes
- → Improving UPC++ team support

See French et al, IPDPS 2015 for parallelization overview.





#### **Load Balancing and Irregular Matrix Transpose**

- Hartree Fock example (e.g., in NWChem)
  - Inherent load imbalance
  - UPC++
    - Work stealing and fast atomics
    - Distributed array: easy and fast transpose
  - Impact
    - 20% faster than the best existing solution (GTFock with Global Arrays)







David Ozog , Amir Kamil , Yili Zheng, Paul Hargrove , Jeff R. Hammond, Allen Malony, Wibe de Jong, Katherine Yelick



#### Hartree Fock Code in UPC++



#### Strong Scaling of UPC++ HF Compared to GTFock with Global Arrays on NERSC Edison (Cray XC30)

David Ozog , Amir Kamil , Yili Zheng, Paul Hargrove , Jeff R. Hammond, Allen Malony, Wibe de Jong, Katherine Yelick



#### **UPC++ Communication Speeds up AMR**

- Adaptive Mesh Refinement on Block-Structured Meshes
  - -Used in ice sheet modeling, climate, subsurface (fracking),





Hierarchical UPC++ (distributed / shared style)

- UPC++ plus UPC++ is 2x faster than MPI plus OpenMP
- MPI + MPI also does well



#### **Beyond Put/Get: Event-Driven Execution**

- DAG Scheduling in a distributed (partitioned) memory context
- Assignment of work is static; schedule is dynamic
- Ordering needs to be imposed on the schedule
  - Critical path operation: Panel Factorization
- General issue: dynamic scheduling in partitioned memory
  - Can deadlock in memory allocation
  - "memory constrained" lookahead

Uses a Berkeley extension to UPC to remotely synchronize





#### symPACK: Sparse Cholesky



(a) Structure of Cholesky factor L

hatrix A

 Sparse Cholesky using fan-both algorithm in UPC++ -Uses asynchronous tasks with dependencies Matthias Jacquelin, Yili Zheng, Esmond Ng, Katherine Yelick



#### symPACK: Sparse Cholesky



 $10^{2}$ 

BERKELEY LA

Time (s)

Figure 7: Impact of communication strategy and scheduling on symPACK performance

- Scalability of symPACK on Cray XC30 (Edison)
  - Comparable or better than best solvers (evaluation in progres
  - Notoriously hard parallelism problem

Matthias Jacquelin, Yili Zheng, Esmond Ng, Katherine Yelick

#### **Common Pattern for Distributed Data Structures**

 Many UPC programs avoid the UPC style arrays in factor of directories of objects

typedef shared [] double \*sdblptr;

shared sdblptr directory[THREADS];

directory[i]=upc\_alloc(local\_size\*sizeof(double));



- These are also more general:
  - Multidimensional, unevenly distributed
  - Ghost regions around blocks

physical and conceptual 3D array layout



## **Summary: PGAS for Irregular Applications**

- Lower overhead of communication makes PGAS useful for latency-sensitive problems or bisection bandwidth problems
- Specific application characteristics that benefit:
  - -Fine-grained updates (Genomics HashTable construction)
  - -Latency-sensitive algorithms (Genomics DFS)
  - -Distributed task graph (Cholesky)
  - -Work stealing (Hartree Fock)
  - -Irregular matrix assembly / transpose (Seismic, HF)
  - -Medium-grained messages (AMR)
  - -All-to-all communication (FFT)
- There are also benefits of thinking algorithmically in this model: parallelize things that are otherwise hard to imagine





### Summary: PGAS for Modern HPC Systems

- The lower overhead of communication is also important given current machine trends
  - -Many lightweight cores per node (do not want a hefty serial communication software stack to run on them)
  - -**RDMA mechanisms** between nodes (decouple synchronization from data transfer)
  - -GAS on chip: direct load/store on chip without full cache coherence across chip
  - -Hierarchical machines: fits both shared and distributed memory, but supports hierarchical algorithms
  - -New models of memory: High Bandwidth Memory on chip or NVRAM above disk





## Installing Berkeley UPC++, UPC, and GASNet

Available on Mac OSX, Linux, Infiniband clusters, Ethernet clusters, and most HPC systems

- UPC++ Open source with BSD license
- https://bitbucket.org/upcxx
- UPC++ installation
- https://bitbucket.org/upcxx/upcxx/wiki/Installing%20UPC++
- GASNet communication
   <u>https://gasnet.lbl.gov</u>
- Examples
  - -DAXPY, Conjugate Gradient, FFT, GUPS, MatrixMultiply, Mutigrid, Minimum Degree Ordering, Sample Sort, Sparse Matrix-Vector mutliply





#### **Using Berkeley UPC at NERSC or ALCF**

Load the bupc module via module load bupc

<u>Compile code with the upcc</u> upcc -V // shows version



Add the following line to your ~/.soft file: PATH += /home/projects/pgas/berkeley\_upc-2.22.3/V1R2M2/gcc-narrow/bin/ OR, if using the xl compilers, add: PATH += /home/projects/pgas/berkeley\_upc-2.22.3/V1R2M2/xlc-narrow/bi Run resoft Compile with upcc. To see the version and configuration, run upcc -V











# UPC++ V1.0 A C++ Library for Lightweight PGAS Programing

Led by Scott B. Baden and Paul Hargrove (LBNL) Presented by Amir Kamil (LBNL/University of Michigan)

#### **UPC++ V1.0 Overview**

- A complete redesign of UPC++ that leverages GASNet-EX to deliver better performance and scalability
- A "compiler-free" approach for PGAS
  - -Leverage C++ standards and compilers
  - -Influence future directions of the C++ standard
- Interoperates with existing programming systems
  - -1-to-1 mapping between MPI rank and UPC++ rank
  - -OpenMP and CUDA can be easily mixed with UPC++ in the same way as MPI+X
- Design philosophy:

All communication is explicit Most operations are non-blocking to encourage asynchronous programming No non-scalable data structures



#### Hello World in UPC++

- If you compile and run a UPC++ program with P ranks, it will run P copies of the program
- However, need to initialize UPC++ before calling any UPC++ functions:



## The API

- Foundational types
  - -Global Pointers
  - -Futures (and promises)
  - -Distributed Objects
- Communication
  - -1-sided Communication
    - rput/rget (bulk and single element), non-contiguous transfers, memory kinds
  - -RPC (remote procedure call)
- Callbacks
- Remote Atomics
- Teams (mechanism for grouping ranks together)
- Progress and the Memory Model



#### **Example: Monte Carlo Pi Calculation**

- Estimate Pi by throwing darts at a unit square
- Calculate percentage that fall in the unit circle

-Area of square =  $r^2 = 1$ 

-Area of circle quadrant =  $\frac{1}{4} * \pi r^2 = \frac{\pi}{4}$ 

- Randomly throw darts at x,y positions
- If  $x^2 + y^2 < 1$ , then point is inside circle
- Compute ratio:
  - -# points inside / # points total

 $-\pi = 4$ \*ratio





#### Pi in UPC++

• Independent estimates of pi:

```
int main(int argc, char **argv) {
```

```
upcxx::init();
```

int hits, trials = 0;

double pi;

Each rank gets its own copy of these variables

if (argc != 2) trials = 1000000; else trials = atoi(argv[1]);

Each rank can use input arguments

srand(upcxx::rank\_me()\*17);

Initialize random in math library

```
for (int i=0; i < trials; i++) hits += hit();
pi = 4.0*hits/trials;
cout << "PI estimated to " << pi << endl;
upcxx::finalize();
Each rank calls "hit" separately</pre>
```



#### Helper Code for Pi in UPC++

- Required includes:
   #include <iostream>
   #include <cstdlib>
   #include <upcxx/upcxx.hpp>
- Function to throw dart and calculate where it hits: int hit() {

```
double x = ((double) rand()) / RAND_MAX;
double y = ((double) rand()) / RAND_MAX;
if (x*x + y*y <= 1.0) {
    return 1;
} else {
    return 0;
}
```



#### **C++11 Helper Code for Pi**

 Required includes and variables: #include <iostream> #include <random>

#include <random/
#include <upcxx/upcxx.hpp>
default\_random\_engine generator;
uniform\_real\_distribution<> dist(0.0, 1.0);

• Function to throw dart and calculate where it hits: int hit() { double x = dist(generator);

```
double y = dist(generator);
```

```
if (x*x + y*y <= 1.0) {
    return 1;</pre>
```

```
} else {
```

return 0;

```
UPC++ allows full use
of the C++ Standard
Template Library
```



#### Private vs. Shared Memory in UPC++

- Normal C++ variables and objects are allocated in the private memory space for each thread
- Memory from the shared space is allocated explicitly

global\_ptr<int> gptr =
 new\_<int>(rank\_me());
int mine;

upcxx:: qualifier elided from here on out UPC++ names in green

Shared memory can be accessed from a remote rank



#### **Futures**

- UPC++ has no *implicit* blocking
   We underline blocking operations
- A *future* holds a sequence of values and a state (ready / not ready)
- Waiting on the returned future lets user tailor degree of asynchrony they desire

```
future<T> f1 = rget(gptr1); // asynchronous op
future<T> f2 = rget(gptr2);
// unrelated work...
bool ready = f1.ready(); // non-blocking poll
wait(f1); // block until future is ready
T t = f1.result(); // fails if not ready
```



#### **One-Sided Communication**

Remote read

future<T> rget(global\_ptr<T> src);

Remote write

future<> rput(T val, global\_ptr<T> dest);

- -There is also a signaling version, that runs a handler at the destination *after* rput operation is visible at the target
- Support for non-contiguous transfers



#### Pi in UPC++: Shared Memory Style

```
    Parallel computing of pi, but with a bug

   int main(int argc, char **argv) {
                                       divide work up evenly
      init();
      int trials = atoi(argv[1]);
      int my trials = (trials+rank n()-1)/rank n();
      global ptr<int> hits =
                                                 broadcast
        wait(broadcast(new <int>(0), 0));
                                                 pointer to
                                                 shared
      srand(rank me()*17);
                                                 memory
      for (int i=0; i < my trials; i++) {
                                                 from rank 0
        int old hits = wait(rget(hits));
                                              accumulate hits
        wait(rput(old hits+hit(), hits));
                                              block on
                                              communication
      barrier();
      if (rank me() == 0)
        cout << "PI estimated to "
              << 4.0*(*hits.local())/trials;
      finalize();
                     What is the problem with this program?
                                                          ERKELE
```

#### **UPC++ Synchronization**

- UPC++ has two basic forms of barriers:
  - Barrier: block until all other threads arrive <u>barrier()</u>;
  - Asynchronous barriers

future<> f =

barrier\_async(); // this thread is ready for barrier
// do computation unrelated to barrier
wait(f); // wait for others to be ready

 Shared data can be synchronously updated by sending the update to the owner as an RPC (remote procedure call)





#### future<R> rpc(intrank\_t r,

F func, Args&&... args);

- -Executes func (args...) on rank r and returns the result
- -R is the return type of func
  - Empty future if func returns void
- -There is also a 'fire and forget' version that returns no result
- -Some restrictions apply to what UPC++ operations can be issued in an RPC: the *restricted context* 
  - Limits on blocking operations from within an RPC





#### Pi in UPC++: RPC

```
• RPC used to synchronize updates
    int hits = 0; RPC can refer to global variable
    int main(int argc, char **argv) {
      init();
      int trials = atoi(argv[1]);
      int my trials = (trials+rank_n()-1)/rank_n();
      srand(rank me()*17);
      for (int i=0; i < my_trials; i++) {</pre>
         wait(rpc(0, [](int hit) { hits += hit; },
                   hit()));
      }
                                       send update to rank 0
      barrier();
                                       block on the update
      if (rank me() == 0)
        cout << "PI estimated to " << 4.0*hits/trials;
      finalize();
```



#### Pi in UPC++: Data Parallel Style w/ Collectives

- The previous version of Pi works, but is not scalable:
   Updates are serialized on rank 0, ranks block on updates
- Use a reduction for better scalability:

```
// int hits; no global variables or shared memory
int main(int argc, char **argv) {
  . . .
  for (int i=0; i < my_trials; i++)</pre>
     my hits += hit();
 my hits = // input, binary op
     wait(allreduce(my hits, std::plus<int>));
  // barrier();
                             barrier implied by reduction
  if (rank me() == 0)
    cout << "PI: " << 4.0*my hits/trials;</pre>
  finalize();
```

#### **Distributed Objects**

- Any C++ type can be made into a *distributed object*
- One instance on every rank of a team class Mesh { public: Mesh(A, B, C); private: ... }; A a; B b; C c; dist\_object<Mesh> dmesh(myTeam, a, b, c); dist\_object<int> counter(0); // over world team

-Collective over team, but not blocking

Can access remote instances within team

auto f1 = rpc(someRank,

```
[foo] (dist_object<Mesh> &remote) {
```

```
remote->someFunction(foo);
```

```
return remote->recalc(); },
```

```
dmesh) ;
```

future<int> f2 = fetch(counter, someRank);



#### **Pi in UPC++: Distributed Object Version**

- Alternative fix to the race condition
- Have each rank update a separate counter:

```
-Do it in a distributed object, have one rank compute sum
int main(int argc, char **argv) {
                                             all hits
  ... declarations and initialization code omitted
                                             distributed
  dist object<int> all hits(0);
                                             across all ranks
  for (int i=0; i < my trials; i++)</pre>
    *all hits += hit(); update element
                            with local affinity
  barrier();
  if (rank me() == 0) {
                                              collect each
    for (int i=0; i < rank n(); i++)</pre>
                                              rank's
      hits += wait(fetch(all hits, i));
                                              contribution
    cout << "PI estimated to " << 4.0*hits/trials;</pre>
  }
  finalize();
```

#### **Distributed Objects in Stencil Code**



#### Summary

- UPC++ is a PGAS library that supports lightweight communication over GASNet-EX
- Close to the metal performance, lean interface
  - -Trade offs to reduce overheads and increase flexibility
    - Asynchronous and explicit communication
    - Reduced consistency guarantees
- Advanced features not covered in talk:
  - Promises, callbacks, remote atomics, progress, memory model, teams
- V1.0 release targeted for September 30, 2017

-Will include programmer's guide



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