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Hybrid Programming Challenges for Extreme Scale Software

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Multicore Processors and Extreme Scale Systems

- Characteristics of Extreme Scale systems in the next decade
 - Massively multi-core --- 1000+ homogeneous/heterogeneous cores per node
 - Performance driven by parallelism, constrained by energy
 - Subject to frequent faults and failures
- Many Classes of Extreme Scale Systems



Mobile, < 10 Watts, O(10¹) concurrency

Key Challenges

- Energy Efficiency
- Concurrency
- Resiliency



Embedded, 100's of Watts,

O(10³) concurrency

DK DK



Departmental, 100's of KW, O(10⁶) concurrency

Data Center > 1 MW, O(10⁹) concurrency

- Efficiency
- References:
 - DARPA Exascale Software study, V. Sarkar et al, Sep 2009
 - "Software Challenges in Extreme Scale Systems". V. Sarkar, W. Harrod, A.E. Snavely. SciDAC Review, January 2010.



What is "Hybrid Programming"?





Liger

Zonkey





Observation: definition of "Hybrid" depends on your starting point

- If your starting point is a bulk-synchronous SPMD program with one thread per rank, then "hybridizations" have to be implemented as specialcase extensions, e.g.,
 - Asynchronous data movements across ranks
 - Task parallelism within a rank
 - Accelerator parallelism
 - Task/process cancellation and migration





Alternate Approach: Hybrid by Design



- If your starting point is a general unified execution model and runtime system for extreme scale computing, then "hybridizations" are simply combinations of features, e.g.,
 - Integration of task parallelism and message passing
 - Integration of fork-join and point-to-point synchronization
 - Integration of actors and collectives

• . .



Programmability Challenge ---- Bridging the Expertise Gap between Domain Experts and Concurrency Experts





Rice Habanero Multicore Software Project: Enabling Technologies for Extreme Scale

Parallel Applications

Portable execution model

1) Lightweight asynchronous tasks and data transfers

• Creation: async tasks, future tasks, data-driven tasks

Termination: finish, future get, await

Data Transfers: asyncPut, asyncGet

2) Locality control for task and data distribution

 Computation and Data Distributions: hierarchical places, global name space

- 3) Inter-task synchronization operations
- Mutual exclusion: isolated, actors

 Collective and point-to-point operations: *phasers, accumulators*



<u>Two-level programming model</u> Declarative Coordination Language for Domain Experts: CnC-HC, CnC-Java, CnC-Python, CnC-Matlab, ... +

Task-Parallel Languages for Parallelism-aware Developers: Habanero-C, Habanero-Java, Habanero-Scala



Extreme Scale Platforms

Target Platforms

Habanero programs have been executed on a wide range of production and experimental systems

- Multicore SMPs (IBM, Intel)
- Discrete GPUs (AMD, NVIDIA)
- Integrated GPUs (AMD, Intel)
- FPGA (Convey, w/ GPU added)
- HPC Clusters
- Hadoop Clusters
- Experimental processors: IBM Cyclops, Intel SCC



Elements of Habanero Execution Model

- 1) Lightweight asynchronous tasks and data transfers
- Creation: async tasks, future tasks, data-driven tasks
- Termination: finish, future get, await
- Data Transfers: asyncPut, asyncGet
- 2) Locality control for control and data distribution
- Computation and Data Distributions: hierarchical places, global name space
- 3) Inter-task synchronization operations
- Mutual exclusion: global/object-based isolation, actors
- Collective and point-to-point operations: phasers, accumulators
 Goal: unified model of parallelism that spans a wide range of

extreme scale platforms



Example: Habanero abstraction of a CUDA kernel invocation







Properties of Habanero Execution Model

- Deadlock freedom guarantee for large subset of operations
 - All operations except explicit wait in phasers, accumulators and explicit await clause in async
- Data-race freedom guarantee for subset of data accesses
 - Future values, accumulator values
 - Read-write permission regions
 - Isolated accesses, actors
- Determinacy guarantee for subset of programs
 - Data-race freedom implies determinacy for all programs that do not use mutual exclusion constructs (isolated, actors)
- Amenable to efficient asynchronous and portable implementations
 - Locality-aware work-stealing
 - Hierarchical places with support for heterogeneous processors
 - Integration with cluster-level communication runtime systems
 - Scalable synchronization with phasers, accumulators and delegated isolation
 - Compiler optimizations for structured parallelism



Semantic Classification of Habanero Parallel Programs



- Legend
 - DLF = DeadLock-Free
 - DRF = Data-Race-Free
 - DET = Determinate
 - DRF→DET = DRF implies DET
 - SER = Serializable
- If a Habanero program only uses async, finish, and future constructs (no mutual exclusion), then it is guaranteed to belong to the DLF + DRF → DET + SER class
- Adding phasers yields programs in the DLF + DRF →DET class
- Adding async await yields programs in the DRF → DET class
- Restricting shared data accesses to futures, isolated, actors yields programs in the DRF-ALL class

"Habanero-Java: the New Adventures of Old X10." Vincent Cave, Jisheng Zhao, Jun Shirako,
 Vivek Sarkar PPPJ 2011.



Pedagogy using Habanero execution model,

COMP 322: Fundamentals of Parallel Programming Sophomore-level CS Course at Rice

- https://wiki.rice.edu/confluence/display/PARPROG/COMP322
- Approach mid-level parallel programming model
 - "Simple things should be simple, complex things should be possible"
 - Introduce students to fundamentals of parallel programming
 - Primitive constructs for task creation & termination, collective & point-topoint synchronization, task and data distribution, and data parallelism
 - Abstract models of parallel computations and computation graphs
 - Parallel algorithms & data structures including lists, trees, graphs, matrices
 - Common parallel programming patterns
 - Use Habanero-Java (HJ) library for Java 8 as pedagogic programming model to understand fundamentals in two-thirds of course, and then introduce students to lower-level parallel programming models (Java threads, MPI, CUDA) using HJ principles
- RICE



1) Primitives for Lightweight Asynchronous Tasks

async S

- Creates a new child task that executes statement S
 - Like OpenMP's task pragma
- Parent task moves on to statement following the async
- async can be a computation or a communication task

finish S

- Execute S, but wait until all (transitively) spawned asyncs in S's scope have terminated
 - Like OpenMP's taskwait
- Implicit finish between start and end of main program
- Use of finish cannot create a deadlock cycle



Parallel Spanning Tree Algorithm using Habanero-Java Library

```
1. class V
     V [] neighbors; // Input adjacency list
2.
                                                                 DFS
3.
     V parent; // Output spanning tree
4.
                                                               compute
5.
     boolean tryLabeling(final V n) {
       return isolatedWithReturn(this, () -> {
6.
7.
         if (parent == null) parent = n;
                                                         compute
8.
         return parent == n;
9.
      });
10.
     } // tryLabeling
                                                                               compute
                                                    compute
     void compute() {
11.
12.
       for (int i=0; i<neighbors.length; i++) {</pre>
13.
         final V child = neighbors[i];
                                                                 Async edge
14.
         if (child.tryLabeling(this))
15.
              async(()->{child.compute()}); //escaping async Finish edge
16.
        }
17.
     } // compute
18. } // class V
19.
20. root.parent = root; //Use self-cycle to identify root
21. finish(()->{root.compute()});
```

Data-Driven Futures (DDFs) and Data-Driven Tasks (DDTs) in Habanero-C language

DDF_t* ddfA = DDF_CREATE();

• Allocate an instance of a <u>data-driven-future</u> object (container)

async AWAIT(ddfA, ddfB, ...) <Stmt>

 Create a new <u>data-driven-task</u> to start executing <u>Stmt</u> after all of <u>ddfA</u>, <u>ddfB</u>, ... become available (i.e., after task becomes "enabled")

DDF_PUT(ddfA, V);

- Store object V in ddfA, thereby making ddfA available
- Single-assignment rule: at most one put is permitted on a given DDF

DDF_GET (ddfA)

- Return value stored in ddfA
- No blocking needed --- should only be performed by tasks that contain ddfA in their AWAIT clause, or when some other synchronization (e.g., finish) guarantees that DDF_PUT must have been performed.

DDFs and DDTs can be more efficient than OpenMP regions and barriers



Smith Waterman example with DDFs (Habanero-C)

```
finish { // matrix is a 2-D array of DDFs
  for (i=0,i<H;++i) {</pre>
    for (j=0,j<W;++j) {</pre>
      DDF t* curr = matrix[i][j];
      DDF t* above = matrix[i-1][j];
      DDF t* left = matrix[i][j-1];
      DDF t* uLeft = matrix[i-1][j-1];
      async AWAIT (above, left, uLeft){
          Elem* currElem =
            init(DDF GET(above),DDF GET(left), DDF GET(uLeft));
          compute(currElem);
          DDF PUT(curr, currElem);
      }/*async*/
    }/*for-j*/
  }/*for-i*/
}/*finish*/
```

2) Locality control for task and data distribution: Hierarchical Place Trees (HPT) abstraction

- HPT approach
 - Hierarchical memory + Dynamic parallelism
- Place denotes affinity group at memory hierarchy level
 - L1 cache, L2 cache, CPU memory, GPU memory
- Leaf places include worker threads
 - e.g., W0, W1, W2, W3
- Explore multiple HPT configurations
 - For same hardware and application
 - Trade-off between locality and load-balance

"Hierarchical Place Trees: A Portable Abstraction for Task Parallelism and Data Movement", Y.Yan et al, LCPC 2009





Locality-aware Scheduling using the HPT

- Workers attached to leaf places
 - Bind to hardware core
- Each place has a queue
 - async at(<pl>) <stmt>: push task onto place pl's queue



- A worker executes tasks from ancestor places from bottom-up
 - W0 executes tasks from PL3, PL1, PL0
- Tasks in a place queue can be executed by all workers in the place's subtree
 - Task in PL2 can be executed by workers W2 or W3



Example: Cholesky Performance with HPT (12-core SMP)



Reference: Runtime Systems for Extreme Scale Platforms.



Sanjay Chatterjee. Ph.D Thesis, December 2013 **21**

LULESH with place annotation (can be selected by programmer, compiler, runtime)

```
finish {
Index_t i_len = numNode;
Index_t i_blk = HAB_C_BLK_SIZE;
int blk_per_child = (int)(i_len/num_children);
for (Index_t i_out = 0; i_out < i_len; i_out += i_blk) {
    Index_t i_end = ((i_out + i_blk) < i_len)?(i_out + i_blk) : i_len;
    place p = myAffinity(i_out, i_end);
    async at(p) {
            for(Index_t gnode = i_out ; gnode < i_end ; ++gnode ) {</pre>
            int xDir = 0;
            int yDir = 1;
            int zDir = 2;
            . . .
                                                                    Reuse takes places across
            }
                                                                    different loops in different
                                                                     functions
                                                    22
```



LULESH Results w/ and w/o use of places in HPT

Timing in seconds on Intel Westmere (2x6cores) for 12 Threads with gcc –O3

	w/o HPT	w/ HPT
LULESH (Problem Size=45)	21.45 secs	19.08 secs

Hardware Performance Counter Ratio

Hardware Perf Counters	L1DCM	L2DCM	L3TCM	TLBDM
НС/НРТ	0.97	1.30	1.50	0.90

DCM: Data Cache Misses, DCA: Data Cache Accesses,

TCM: Total Cache Misses (Inst+Data), TLBDM: TLB Misses

In progress: figuring out why current HPT implementation decreases cache misses but increases TLB misses



Habanero Hierarchical Place Trees for heterogeneous architectures and accelerators



- Devices (GPU or FPGA) are represented as memory module places and agent workers
 - GPU memory configuration are fixed, while FPGA memory are reconfigurable at runtime
- async at(P) S
 - Creates new activity to execute statement S at place P
- Explicit data transfer between main memory and device memory when needed

•Use of copyin/copyout clauses to improve programmability of data transfers

- Device agent workers
 - Perform asynchronous data copy and task launching for device



Medical imaging application (Center for Domain-Specific Computing)



Adding Affinity Annotations for Heterogeneous Computing



- CnC graph representation extended with tag functions and affinity annotations:
 - < C > :: (D @CPU=20,GPU=10);

$$\begin{bmatrix} IN : k-1 \end{bmatrix} \rightarrow (D:k) \rightarrow [IN2 : k+1];$$

$$\begin{bmatrix} IN2 : 2^{*}k \end{bmatrix} \rightarrow (R:k) \rightarrow [IN3 : k/2];$$

$$\begin{bmatrix} IN3 : k \end{bmatrix} \rightarrow (S:k) \rightarrow [OUT : IN3[k]];$$

env \rightarrow [IN : { 0 .. 9 }], < C : { 0 .. 9 } >; [OUT : 1] \rightarrow env;

"Mapping a Data-Flow Programming Model onto Heterogeneous Platforms." Alina Sbirlea, Yi Zou, Zoran Budimlic, Jason Cong, Vivek Sarkar. LCTES 2012

Convey HC-1ex Testbed



Static vs Dynamic Scheduling

- < C > :: (D @CPU=20,GPU=10);
- < C > :: (R @GPU=5, FPGA=10);
- < C > :: (S @GPU=12);



Dynamic Schedule





Experimental results

 Execution times and active energy with dynamic work stealing





Integrating Inter-node Communication with Intra-node Task Scheduling



"Integrating Asynchronous Task Parallelism with MPI." Sanjay Chatterjee, Sagnak Tasirlar, Zoran Budimlic, Vincent Cave, Milind Chabbi, Max Grossman, Yonghong Yan, Vivek Sarkar. IPDPS 2013.

UTS Performance on T1XXL



- Jaguar Supercomputer at ORNL
- 18688 nodes with Gemini Interconnect
- 16 core AMD Opteron nodes with 32 GB memory



UTS Scaling on T1XXL

Unbalanced Tree Search Performance Scaling

-HCMPI -MPI



Failed steals lead to scalability bottleneck in MPI

- At 256 nodes: MPI suffers 2.35M failed steals while HCMPI suffers 0.82M
- At 1024 nodes: MPI suffers 94.75M failed steals while HCMPI suffers 8.83M



APGNS Programming Model

Philosophy :

- In the Habanero Asynchronous Partitioned Global Name Space (APGNS) programming model, distributed tasks communicate via distributed data-driven futures, each of which has a globally unique id/name (guid).
- Asynchronous one-sided communication model
- APGNS can be implemented on a wide range of communication runtimes including MPI and GASNet, regardless of whether or not a global address space is supported.





Multi-Node SmithWaterman



```
1. #define DDF HOME(guid) . . .
2. for (i=0;i<H;++i)
     for (j=0;j<W;++j)</pre>
3.
4.
       matrix[i][j] = DDF_HANDLE(i*H+j);
5. doInitialPuts(matrix);
6. finish {
     for (i=0,i<H;++i) {</pre>
7.
       for (j=0,j<W;++j) {</pre>
8.
9.
         DDF t* curr = matrix[i][j];
10.
      DDF t* above = matrix[i-1][j];
         DDF t* left = matrix[i][j-1];
11.
12. DDF t* uLeft = matrix[i-1][j-1];
13.
         if ( isHome(i,j) ) {
14.
           async AWAIT (above, left, uLeft){
15.
             Elem* currElem =
16.
               init(DDF GET(above),
17.
                    DDF GET(left),
18.
                    DDF GET(uLeft));
19.
             compute(currElem);
20.
             DDF PUT(curr, currElem);
          }/*async*/
21.
22.
         }/*if*/
       }/*for*/
23.
     }/*for*/
24.
25. }/*finish*/
```



Results for APGNS version of SmithWaterman (communication runtime uses MPI under the covers)



3) Mutual exclusion --- isolated statement

isolated <body>

- Like a critical section --- two tasks executing isolated statements must perform the isolated statements in mutual exclusion
 - →Weak atomicity guarantee: mutual exclusion only applies to (isolated, isolated) pairs of statement instances, not to (isolated,non-isolated) pairs
- Isolated statements may be nested, and may contain async and finish statements
 - See "Isolation for Nested Task Parallelism" [OOPSLA 2013] for details
- In case of an exception, all updates performed by <body> before throwing the exception will be observable after exiting <body>
- NOTE: mutual exclusion is intended for nondeterministic parallel programs





Object-based isolation in HJ

isolated(<object-list>) <body>

- In this case, programmer specifies list of objects for which isolation is required
- Mutual exclusion is only guaranteed for instances of isolated statements that have a non-empty intersection in their object lists
 - Standard isolated is equivalent to isolated(*) by default i.e., isolation across all objects
- Implementation can choose to distinguish between read/write accesses for further parallelism
 - Current Habanero implementation supports object-based isolation, but does not exploit read/write distinction



Isolation by default

- Challenge: what if every async task could be isolated by default?
- Transactional memory approaches still incur too much overhead, and lack support for nested transactions
- Delegated Isolation approach:
 - Task dynamically acquires ownership of each object accessed in isolated block (optimistic parallelism)
 - On conflict, task A transfers all ownerships to conflicting task B and delegates execution of isolated block to B
 - More complex rules for nested transactions (see OOPSLA '13 paper for details)
 - Deadlock-freedom and livelock-freedom guarantees
 - Open question: use of recent hardware TM capabilities

• "Delegated Isolation", R. Lublinerman, J. Zhao, Z. Budimlic, S. Chaudhuri, V. Sarkar, OOPSLA 2011

• "Isolation for Nested Task Parallelism", J. Zhao, R. Lublinerman, Z. Budimlic, S. Chaudhuri, V. Sarkar, OOPSLA 2013.

Performance: DMR benchmark on 16-core Xeon SMP

(100,770 initial triangles of which 47,768 are "bad"; average # retriangulations is ~ 130,000)



"Delegated Isolation", R. Lublinerman, J. Zhao, Z. Budimlic, S. Chaudhuri, V. Sarkar, OOPSLA 2011

to

3) Actors: an alternative approach to mutual exclusion by default

An actor may:

- process messages
- send messages
- change local state
- create new actors
- terminate (and release enclosing finish)







Hello World Example

```
1. public class HelloWorld {
2.
    public static void main(final String[] args) {
3.
       finish(() \rightarrow \{
4.
        EchoActor actor = new EchoActor();
       actor.start(); // don't forget to start the actor
5.
       actor.send("Hello"); // asynchronous send (returns immediately)
6.
7.
      actor.send("World");
8.
       actor.send(EchoActor.STOP MSG);
                                            Habanero actor model preserves order of
9.
    });
                                            messages between same sender and receiver
10.}
11.private static class EchoActor extends Actor<Object> {
12. static final Object STOP MSG = new Object();
13.
    private int messageCount = 0;
    protected void process(final Object msg) {
14.
15.
       if (STOP MSG.equals(msg)) {
16.
          println("Message-" + messageCount + ": terminating.");
17.
          exit(); // never forget to terminate an actor
18.
        } else {
          messageCount += 1;
19.
          println("Message-" + messageCount + ": " + msg);
20.} } } }
```

ThreadRing Example

```
1. finish(() -> {
2.
     int numThreads = 4;
     int numberOfHops = 10;
3.
     ThreadRingActor[] ring =
4.
       new ThreadRingActor[numThreads];
     for(int i=numThreads-1;i>=0; i--) {
5.
6.
       ring[i] = new ThreadRingActor(i);
7.
       ring[i].start();
       if (i < numThreads - 1) {
8.
9.
         ring[i].nextActor(ring[i + 1]);
10.
     } }
     ring[numThreads-1].nextActor(ring[0])
11.
12.
     ring[0].send(numberOfHops);
13.}); // finish
```



	14.c	lass ThreadRingActor
	15.	extends Actor <object> {</object>
	16.	<pre>private Actor<object> nextActor;</object></pre>
	17.	private final int id;
	18.	•••
	19.	<pre>public void nextActor(Actor<0bject> nextActor) {}</pre>
	20.	<pre>void process(Object theMsg) {</pre>
	21.	if (theMsg instanceof Integer) {
	22.	Integer n = (Integer) theMsg;
•	23.	if (n > 0) {
7	24.	<pre>println("Thread-" + id +</pre>
	25.	<pre>" active, remaining = " + n);</pre>
	26.	<pre>nextActor.send(n - 1);</pre>
	27.	} else {
	28.	<pre>println("Exiting Thread-"+ id);</pre>
	29.	<pre>nextActor.send(-1);</pre>
	30.	exit();
	31.	}
	32.	} else {
	33.	/* ERROR - handle appropriately */
	34.}	} }

3) Asynchronous Collectives with Finish Accumulators (can be combined with Actors)

```
final FinishAccumulator ac =
1.
2.
                        newFinishAccumulator(Operator.SUM, int.class);
3.
   finish(ac) nqueens_kernel(new int[0], 0);
   System.out.println("No. of solutions = " + ac.get())
4.
5.
    . . .
   void nqueens_kernel(int [] a, int depth) {
6.
7.
     if (size == depth) ac.put(1);
8.
     else
9.
       /* try each possible position for queen at depth */
10.
        for (int i = 0; i < size; i++) async {
         /* allocate a temporary array and copy array a into it */
11.
12.
         int [] b = new int [depth+1];
13.
         System.arraycopy(a, 0, b, 0, depth);
14.
         b[depth] = i;
15.
         if (ok(depth+1,b)) nqueens_kernel(b, depth+1);
16.
       } // for-async
17. } // nqueens_kernel()
```



Role of Runtime Systems

- Inherent variability and complexity of extreme scale platforms calls for a runtime system that is *abstract, asynchronous, usercontrollable, adaptive, and portable*
- Bridging role between programming systems and system software brings multiple benefits
 - composability and hybridization by default,
 - improved performance for existing programming models,
 - enablement of new programming models,
 - simplified interfaces for system software,
 - improved use of system services (e.g., deadlock avoidance),
 - and cleaner code!



Runtime Systems --- how to prime the pump?



System Software



Motivation for an Open Community Runtime (OCR)

- Wide agreement that execution models for extreme scale systems will differ significantly from past execution models
- Shoehorning a new execution model into an old runtime system is counter-productive
- Instead, make a fresh start but carry forward reusable components from current runtime systems as appropriate
 → Motivation for Open Community Runtime framework that
 - is representative of future execution models
 - can be targeted by multiple high-level programming systems
 - can be mapped on to multiple extreme scale platforms
 - is available as an open-source testbed
 - reduces duplication of infrastructure efforts
 - enables us to address revolutionary challenges



Example API: Creating an Event-Driven Task (EDT)

- u8 ocrEdtCreate(ocrGuid_t * guid, ocrGuid_t templateGuid, u32 paramc, u64* paramv, u32 depc, ocrGuid_t *depv, u16 properties, ocrGuid_t affinity, ocrGuid_t *outputEvent);
 - guid [out]: the assigned guid
 - templateGuid: the template the EDT is an instance of
 - paramc: nb of u64 parameters
 - paramv: pointer to u64 parameters
 - depc: nb of guid parameters
 - depv: array of guid dependences (if known at creation or NULL)
 - properties: can specify if finish-edt here.
 - affinity: affinity guid
 - outputEvent [out]: edt completion notification



OCR Vision



Modelado Foundation



- A new Open Source Foundation for Parallel Computing
- Organization
 - Establish an open, transparent environment in which solutions are not predetermined
 - Provide an organic process for community decision-making, ensuring the best solution wins (metrics)
 - Avoid a single player or clique dominating
 - Lower the barrier to participation by providing stable, reliable releases of candidate solutions to a broad audience
 - <u>http://www.modelado.org</u>

Services

- Project Team Infrastructure e.g. source code control, tooling, debuggers, collaboration/communication
- Release Engineering
- Technical Support
- IP management
- Education, instruction and training
- Community Development

Conclusions

- Holistic redesign of software stack is needed to address concurrency, energy, and resiliency challenges of Extreme Scale systems
- Urgent need for execution models that integrate hybrid dimensions of parallelism and heterogeneity – multicore, accelerators, multi-node, HPC cluster, data center cluster
- Well-designed runtime primitives can provide foundation for new execution models, with synergistic innovation in languages, compilers, system software and system hardware
- OCR is a starting point for a strawman community effort --- let's work as a community to extend/replace OCR components as needed!





Habanero Team Pictures (http://habanero.rice.edu)





Send email to Vivek Sarkar (<u>vsarkar@rice.edu</u>) if you are interested in a PhD, postdoc or research scientist position in the Habanero project, or in visiting or collaborating with us!