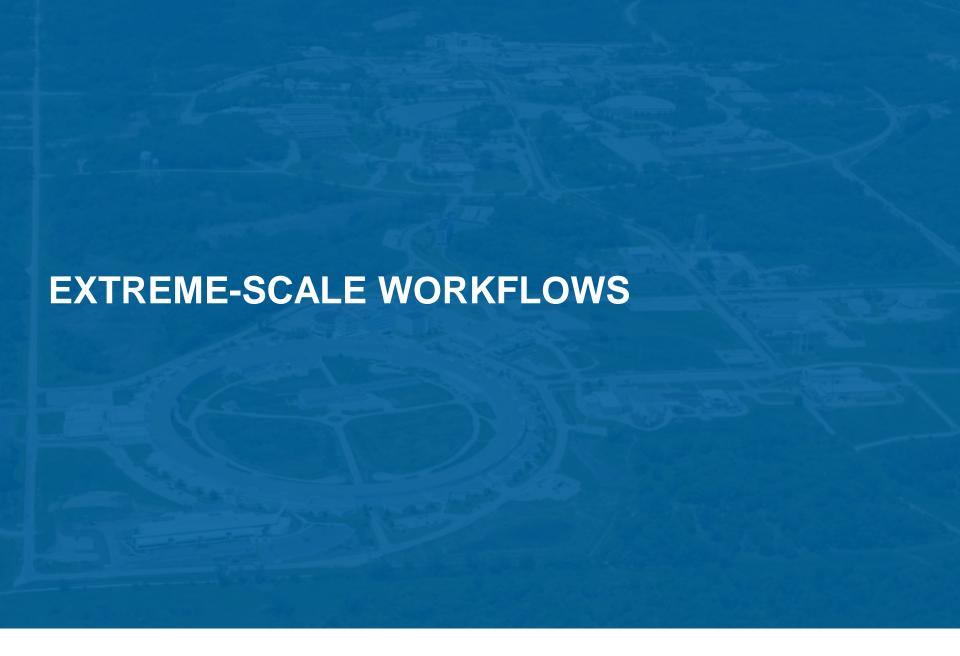
DATAFLOW PROGRAMMING FOR APPLICATION ENSEMBLES



HIGH-PERFORMANCE WORKFLOWS WITH SWIFT/T



JUSTIN M WOZNIAK MCS Division wozniak@mcs.anl.gov





U. CHICAGO HOSPITALS: CANCER ENSEMBLES

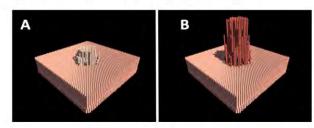
Best paper at SC Cancer Workshop 2016

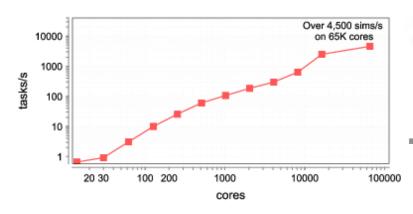
■ Parameter fitting for biological phenomenon (DNA repair rate) via massive scale evolutionary algorithm in Swift/T framework



GIOABM - Integration into SEGMEnT

- · A cancerous cell has three features: immortality, invasiveness, and ability to proliferate
- GIOABM call functionality overlaps with SEGMEnT at four locations:
- · B-catenin: proliferation
- · PI3K: Proliferation/Apoptosis
- · TGF-B/SMAD: Proliferation/Apoptosis
- · P53: Gene repair/Apoptosis
- Added E-cadherin protein mutation to SEGMEnT representing invasiveness

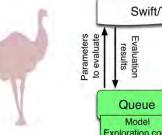


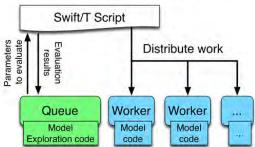




Extreme-scale Model Exploration with Swift (EMEWS)

- EMEWS offers:
 - the capability to run very large, highly concurrent ensembles of simulations of varying types
 - supports a wide class of ME algorithms, including those increasingly available to the community via Python and R libraries
- EMEWS design goal: to ease software integration while providing scalability to the largest scale (petascale plus) supercomputers, running millions of models



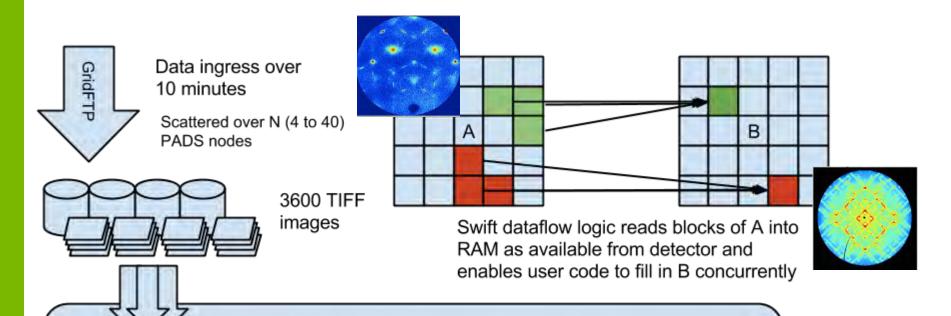


Anatomic-scale cancer modeling using the **Extreme-scale Model Exploration with Swift (EMEWS)** framework. Proc. CACW @ SC, 2016



APS: CRYSTAL COORDINATE TRANSFORMATION WORKFLOW

MapReduce-like pattern expressed elegantly in Swift



Swift/T execution:

- Concurrent read of all TIFFs into Swift memory (blobs) as 3D input matrix
- 2. For each output cell, requisite input cells are retrieved from Swift memory
- Output cells are concurrently computed and written to GPFS for visualization







LANGUAGE GOALS

Hierarchical, naturally parallel, script-like programming

- Make it easy to run large batteries of external program or library executions
- Provide rich programming language at the top level fully generic
- Support implicit concurrency and conventional programming constructs
- Enable complex tasks based in other scripting languages (e.g., Python) or parallel MPI tasks
- Other powerful features- rich data types, resource management, ...

THE SWIFT PROGRAMMING MODEL

All progress driven by concurrent dataflow

```
(int r) myproc (int i, int j)
{
    int x = F(i);
    int y = G(j);
    r = x + y;
}
```

- F() and G() implemented in native code or external programs
- F() and G() run in concurrently in different processes
- r is computed when they are both done
- This parallelism is *automatic*
- Works recursively throughout the program's call graph



SWIFT SYNTAX

Data types

```
int i = 4;
string s = "hello world";
file image<"snapshot.jpg">;
```

Shell access

```
app (file o) myapp(file f, int i)
{ mysim "-s" i @f @o; }
```

Structured data

```
typedef image file;
image A[];
type protein_run {
  file pdb_in; file sim_out;
}
bag<blob>[] B;
```

Conventional expressions

```
if (x == 3) {
    y = x+2;
    s = strcat("y: ", y);
}
```

Parallel loops

```
foreach f, i in A {
    B[i] = convert(A[i]);
}
```

Data flow

- Swift: A language for distributed parallel scripting.
 J. Parallel Computing, 2011
- Compiler techniques for massively scalable implicit task parallelism. Proc. SC, 2014



CENTRALIZED EVALUATION IS A BOTTLENECK AT EXTREME SCALES

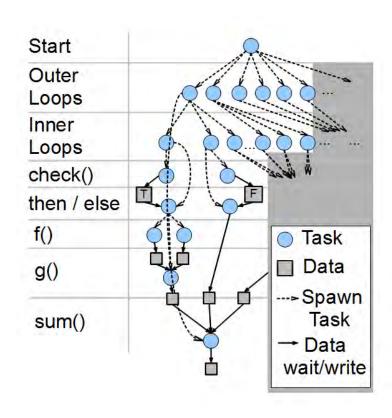
Had this (Swift/K): Now have this (Swift/T): Dataflow program Dataflow program Dataflow engine Engine Engine 500 tasks/s Control tasks Scheduler Queue Queue Work stealing Task Task Task Task Centralized evaluation Distributed evaluation

 Turbine: A distributed-memory dataflow engine for high performance many-task applications. Fundamenta Informaticae 28(3), 2013



SWIFT/T: FULLY PARALLEL EVALUATION OF COMPLEX SCRIPTS

```
int X = 100, Y = 100;
int A[][];
int B[];
foreach x in [0:X-1] {
  foreach y in [0:Y-1] {
    if (check(x, y)) {
      A[x][y] = g(f(x), f(y));
    } else {
      A[x][y] = 0;
  B[x] = sum(A[x]);
```



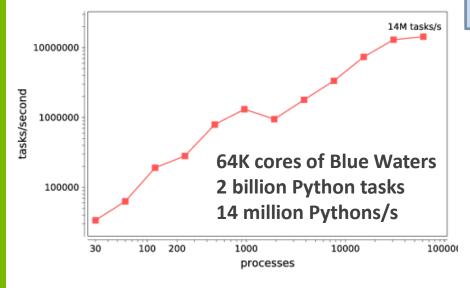


Swift/T: Scalable data flow programming for distributed-memory taskparallel applications. Proc. CCGrid, 2013.

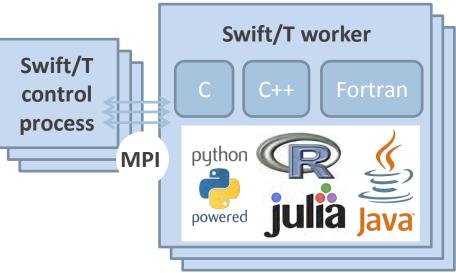
SWIFT/T: ENABLING HIGH-PERFORMANCE SCRIPTED WORKFLOWS

Supports tasks written in many languages

- Write site-independent scripts
- Automatic parallelization and data movement
- Run native code, script fragments as applications
- Rapidly subdivide large partitions for MPI jobs
- Move work to data locations







 Interlanguage parallel scripting for distributed-memory scientific computing.
 Proc. WORKS @ SC 2015



MPI: THE MESSAGE PASSING INTERFACE

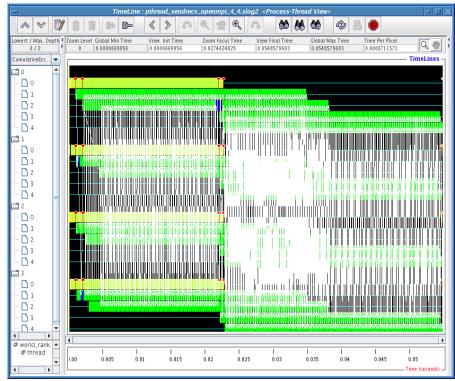
MPI

- Programming model used on large supercomputers
- Can run on many networks, including sockets, or shared memory

Standard API for C and Fortran; other languages have working

implementations

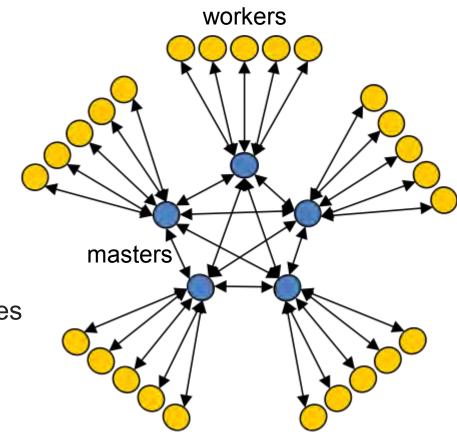
- Contains communication calls for
 - Point-to-point (send/recv)
 - Collectives (broadcast, reduce, etc.)
- Interesting concepts
 - Communicators: collections of communicating processing and a context
 - Data types: Language-independent data marshaling scheme



ASYNCHRONOUS DYNAMIC LOAD BALANCER

ADLB for short

- An MPI library for master-worker workloads in C
- Uses a variable-size, scalable network of servers
- Servers implement work-stealing
- The work unit is a byte array
- Optional work priorities, targets, types
- For Swift/T, we added:
 - Server-stored data
 - Data-dependent execution



 Lusk et al. More scalability, less pain: A simple programming model and its implementation for extreme computing. SciDAC Review 17, 2010

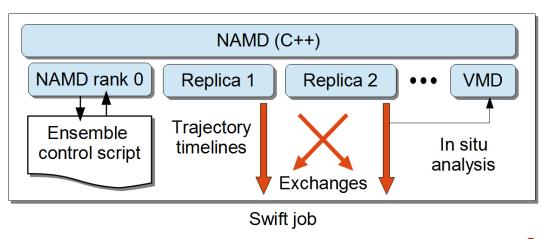






NAMD REPLICA EXCHANGE LIMITATIONS

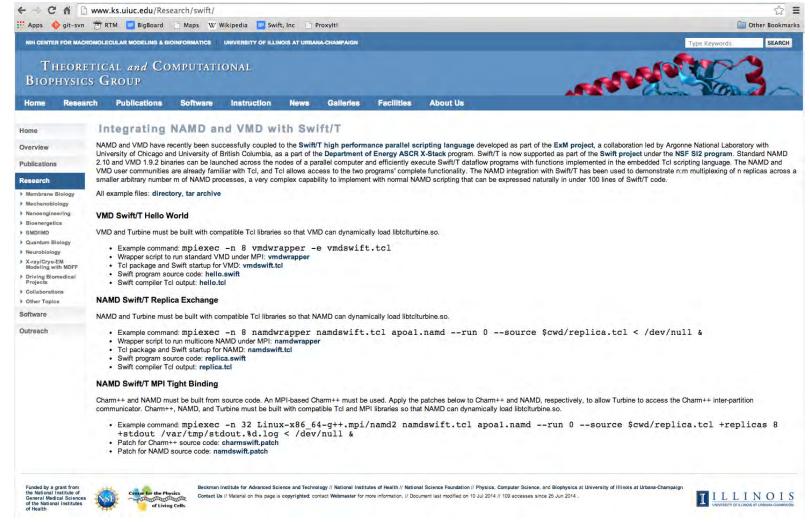
- One-to-one replicas to Charm++ partitions:
 - Available hardware must match science
 - Batch job size must match science
 - Replica count fixed at job startup
 - No hiding of inter-replica communication latency
 - No hiding of replica performance divergence
- Can a different programming model help?





SWIFT INTEGRATION INTO NAMD AND VMD

http://www.ks.uiuc.edu/Research/swift

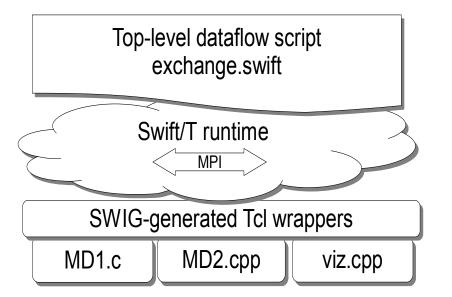




NAMD/VMD AND SWIFT/T

Typical Swift/T Structure

NAMD/VMD Structure



NAMD (C++)

Tcl Evaluation (uplevel-eval)

Top-level dataflow script exchange.swift

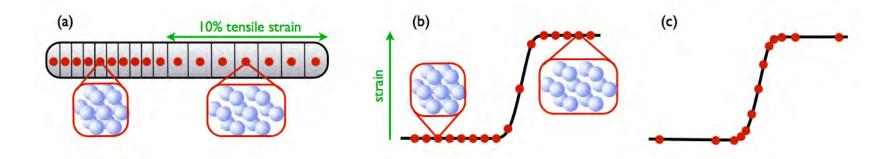
Swift/T runtime

Phillips et al. Petascale Tcl with NAMD, VMD, and Swift/T. Proc. High Performance Technical Computing in Dynamic Languages @ SC, 2014.



EXMATEX: CO-DESIGN FOR MATERIALS RESEARCH

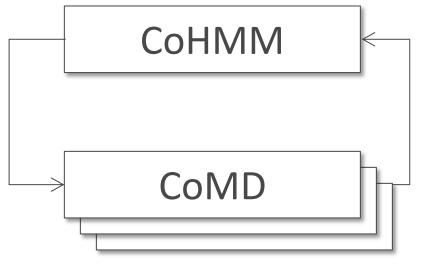
Multi-scale materials modeling



- CoHMM: Heterogeneous Multiscale Method
- CoMD: Molecular Dynamics
- Coarse-grain strain evolution using basic conservation laws
- Fine-grain molecular dynamics as necessary for physical coefficients
- Rapid development of highly concurrent multi-scale simulators with Swift.
 ExMatEx all-hands meeting 2013.
- Swift: Parallel scripting for simulation ensembles. ExMatEx all-hands meeting 2015.



COHMM/SWIFT

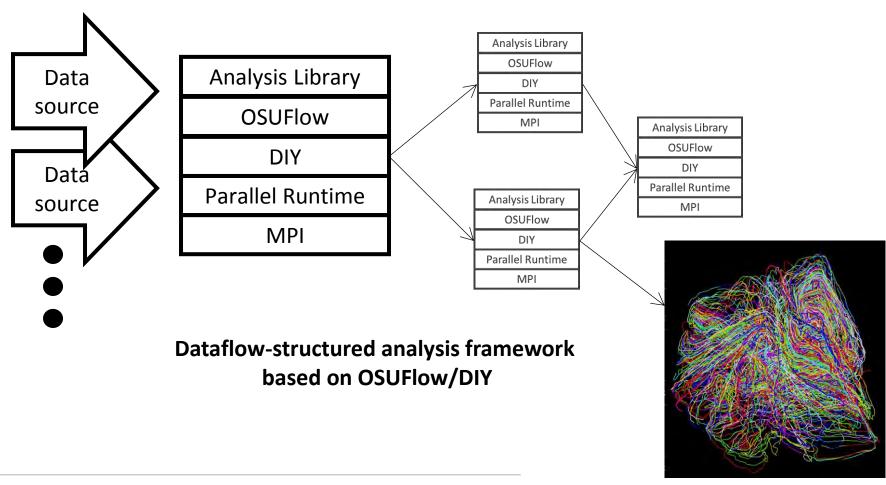


 Concurrency gained primarily by calls to CoMD

- 300 lines of sequential C
- Coordinates multiple sequential calls to CoMD
- We rewrote this in Swift
- 1000's lines of sequential C
- Simplified MD simulator
- Typically called as standalone program
- We exposed CoMD as a Swift function – no exec()



DATAFLOW+DATA-PARALLEL ANALYSIS/VISUALIZATION

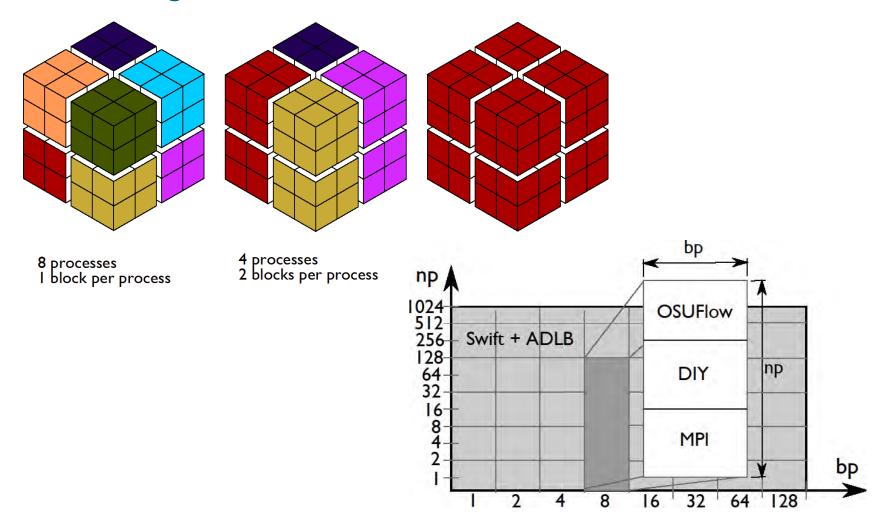


Dataflow coordination of data-parallel tasks via MPI 3.0 Proc. EuroMPI, 2013



PARAMETER OPTIMIZATION FOR DATA-PARALLEL ANALYSIS

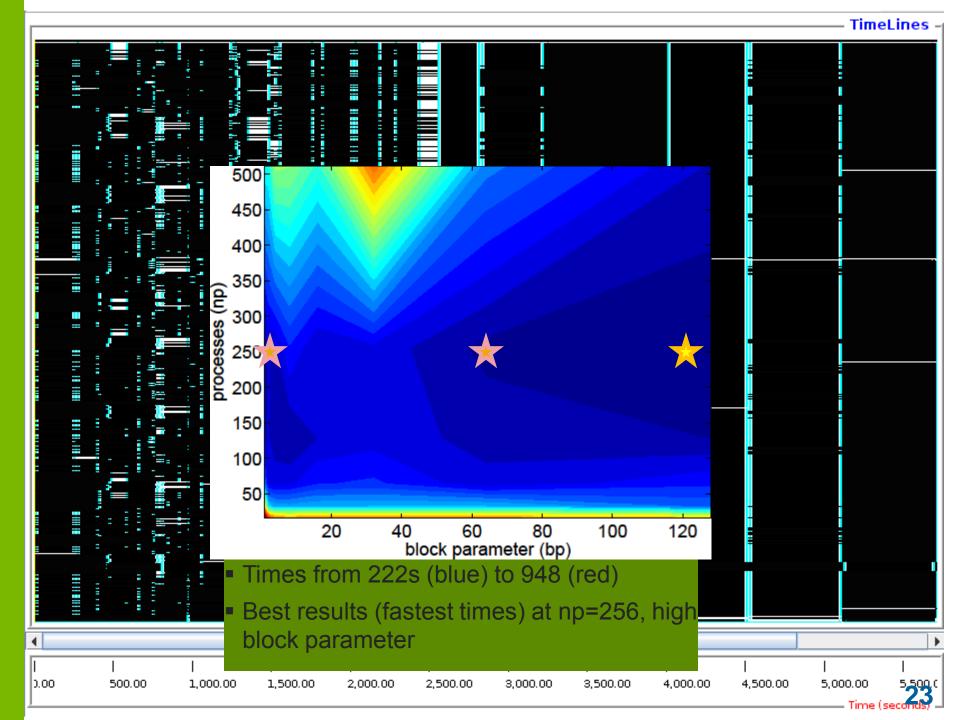
Process configurations



OSUFLOW APPLICATION

Complete code!

```
// Define call to OSUFlow feature MpiDraw
@par (float t) mpidraw(int bf) "mpidraw";
foreach b in [0:7] {
  // Block factor: 1-128
 bf = round(2**b);
  foreach n in [4:9] {
   // Number of processes/task: 16-512
   np = round(2**n);
    t = @par=np mpidraw(bf);
    printf("RESULT: bf=%i np=%i -> time=%0.3f",
                    bf, np, t);
```



LAMMPS PARALLEL TASKS

LAMMPS provides a convenient C++ API

```
foreach i in [0:20] {
    t = 300+i;
    sed_command = sprintf("s/_TEMPERATURE_/%i/g", t);
    lammps_file_name = sprintf("input-%i.inp", t);
    lammps_args = "-i " + lammps_file_name;
    file lammps_input<lammps_file_name> =
        sed(filter, sed_command) =>
        @par=8 lammps(lammps_args);
}
```

This example can be found on GitHub: https://github.com/b240/Workflows/tree/master/demo/LAMMPS-1
See the README.md file for more information.



CAN WE BUILD A MAKEFILE IN SWIFT?

- User wants to test a variety of compiler optimizations
- Compile set of codes under wide range of possible configurations
- Run each compiled code to obtain performance numbers
- Run this at large scale on a supercomputer (Cray XE6)

■ In Make you say:

```
CFLAGS = ...
f.o : f.c
   gcc $(CFLAGS) f.c -o f.o
```

In Swift you say:

```
string cflags[] = ...;
f_o = gcc(f_c, cflags);
```



SWIFT FOR REALLY PARALLEL BUILDS

Plus language features- typed files, arrays, string processing

```
App definitions
app (object_file o) gcc(c_file c, string cflags[])
// Example:
// gcc -c -02 -o f.o f.c
   "gcc" "-c" cflags "-o" o c;
app (x_file x) ld(object_file o[], string ldflags[])
// Example:
             -o f.x f1.o f2.o ...
// gcc
   "gcc" ldflags "-o" x o;
app (output_file o) run(x_file x)
 "sh" "-c" x @stdout=o:
app (timing_file t) extract(output_file o)
 "tail" "-1" o "|" "cut" "-f" "2" "-d" " " @stdout=t:
```

Swift code

```
string program_name = "programs/program1.c";
c_file c = input(program_name);
foreach O_level in [0:3]
  // Construct the compiler flags
  string O_flag = sprintf("-0%i", O_level);
  string cflags[] = [ "-fPIC", O_flag ];
  object_file o<my_object> = gcc(c, cflags);
  object_file objects[] = [ o ];
  string ldflags[] = [];
 // Link the program
 x_file x<my_executable> = ld(objects, ldflags);
 // Run the program
  output_file out<my_output> = run(x);
 // Extract the run time from the program output
  timing_file t<my_time> = extract(out);
```



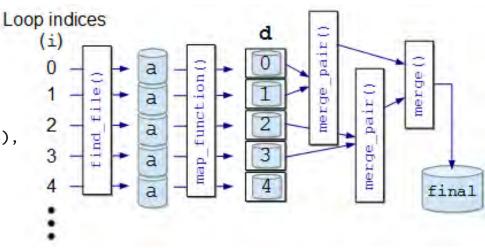




MAPREDUCE IN SWIFT/T

```
file d[];
int N = string2int(argv("N"));
// Map phase
foreach i in [0:N-1] {
  file a = find_file(i);
  d[i] = map_function(a);
// Reduce phase
file final <"final.data"> =
                     merge(d, 0, tasks-1);
(file o) merge(file d[], int start, int stop)
  if (stop-start == 1) {
   // Base case: merge pair
    o = merge_pair(d[start], d[stop]);
  } else {
   // Merge pair of recursive calls
    n = stop-start;
    s = n \% 2;
    o = merge_pair(merge(d, start,
                                       start+s),
                   merge(d, start+s+1, stop));
```

- The user needs to implement map_function() and merge()
- These may be implemented in native code, Python, etc.
- Could add annotations
- Could add additional custom application logic



Big data staging with MPI-IO for interactive X-ray science.
 Proc. Big Data Computing, 2014



FEATURES FOR BIG DATA ANALYSIS

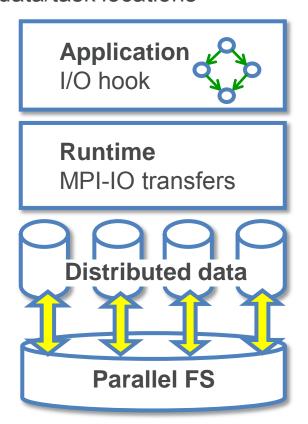
Location-aware scheduling
 User and runtime coordinate
 data/task locations



Runtime
Hard/soft locations



 F. Duro et al. Flexible data-aware scheduling for workflows over an in-memory object store. Proc. CCGrid, 2016. Collective I/O
 User and runtime coordinate data/task locations





TASK LOCATIONS

- User-written annotation on function call
- Swift/T provides a hostmap library that maps host names to MPI ranks
- User annotation sends function to rank:

```
foreach i in 0:N-1 {
  location L = hostmap_lookup("file"+i);
  @location=L f(i);
}
```

- Useful for data-intensive applications or leaf functions with state
- Soft locations: allow queued tasks to be stolen and execute anywhere

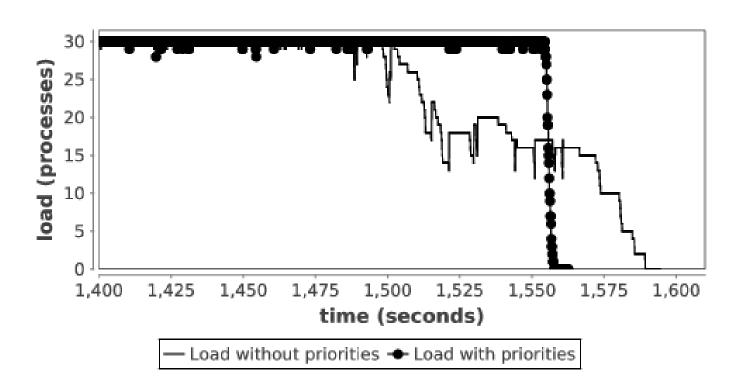
```
foreach i in 0:N-1 {
  location L = hostmap_lookup("file"+i);
  @location=(L, SOFT) f(i);
}
```

Want to automate this in some cases with the @heavy syntax



SWIFT/T: PRIORITIZE LONG-RUNNING TASKS

Variable-sized tasks produce trailing tasks:
 addressed by exposing ADLB task priorities at language level



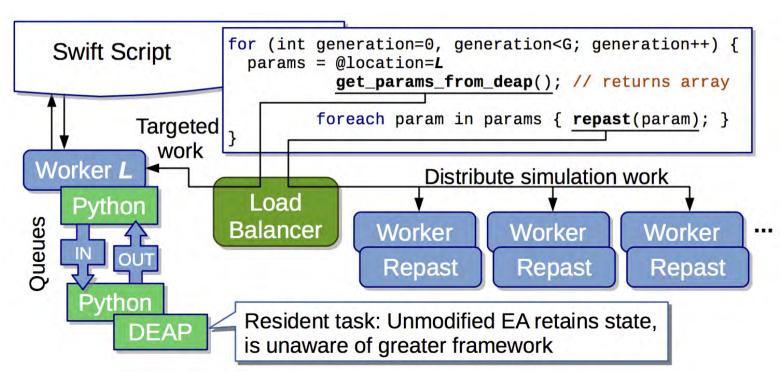






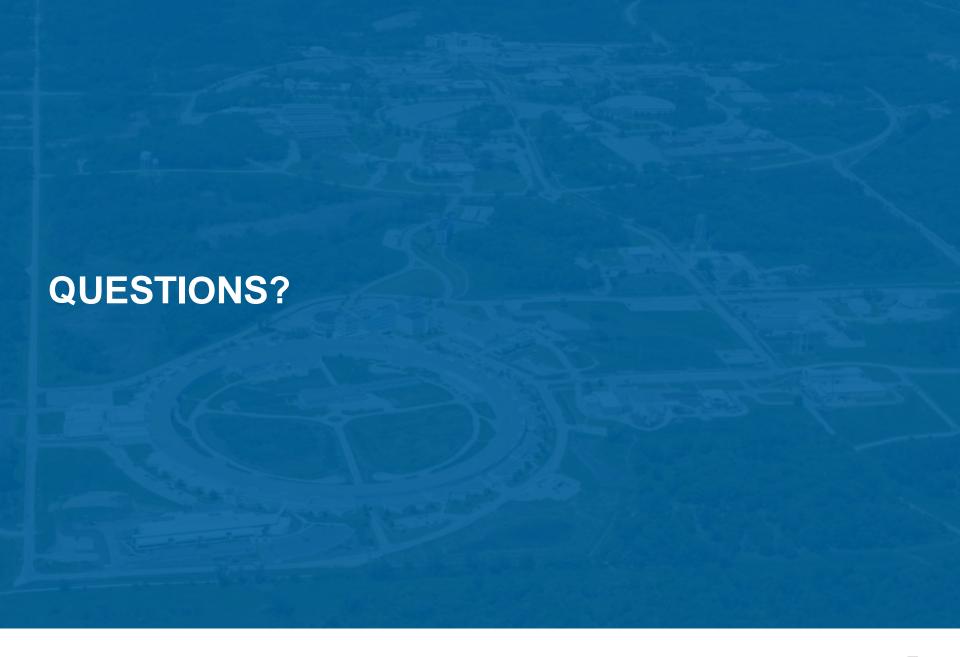
EMEWS: EXTREME-SCALE MODEL EXPLORATION WORKFLOWS IN SWIFT/T

■ To query the state of the EA, we designate one worker on location L for exclusive use by DEAP.



http://www.mcs.anl.gov/~emews/tutorial







LINKS

- Swift/T Home: http://swift-lang.org/Swift-T
- Swift/T Guide: http://swift-lang.github.io/swift-t/guide.html
- Swift/T Sites Guide: http://swift-lang.github.io/swift-t/sites.html
- Swift/T GitHub: https://github.com/swift-lang/swift-t
- This tutorial: https://github.com/swift-lang/tutorial-NCSA-2017
- Support: https://groups.google.com/forum/#!forum/swift-t-user
- Parsl: https://github.com/Parsl/parsl

