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# **COMP 322: Fundamentals of Parallel Programming**

## **Lecture 22: Introduction to the Actor Model**

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# Worksheet #21a solution: Abstract Metrics with Object-based Isolated Constructs

Q: Compute the WORK and CPL metrics for this program with a global isolated construct. Indicate if your answer depends on the execution order of isolated constructs.

```
1.   finish() -> {
2.     for (int i = 0; i < 5; i++) {
3.       async(() -> {
4.         doWork(2);
5.         isolated(() -> { doWork(1); });
6.         doWork(2);
7.       }); // async
8.     } // for
9.   ); // finish
```

Answer: WORK = 25, CPL = 9. These metrics do not depend on the execution order of isolated constructs.



# Worksheet #21b solution: Abstract Metrics with Isolated Constructs

Q: Compute the WORK and CPL metrics for this program with an object-based isolated construct. Indicate if your answer depends on the execution order of isolated constructs.

```
1.   finish(() -> {
2.     // Assume x is an array of distinct objects
3.     for (int i = 0; i < 5; i++) {
4.       async(() -> { // Async task A_i
5.         doWork(2);
6.         isolated(x[i], x[i+1],
7.                   () -> { doWork(1); });
8.         doWork(2);
9.       }); // async
10.    } // for
11.  }); // finish
```

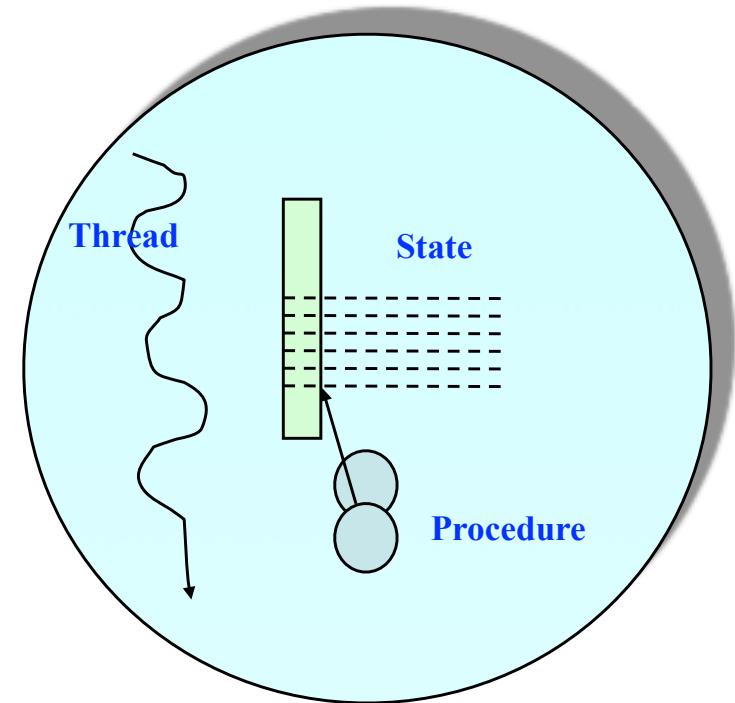
Answer: WORK = 25, worst-case CPL = 7 (e.g., if A\_1, A\_4 execute in parallel first, then the isolated sections in A\_2, A\_3 must be serialized thereafter.)



# Actors: an alternative approach to isolation

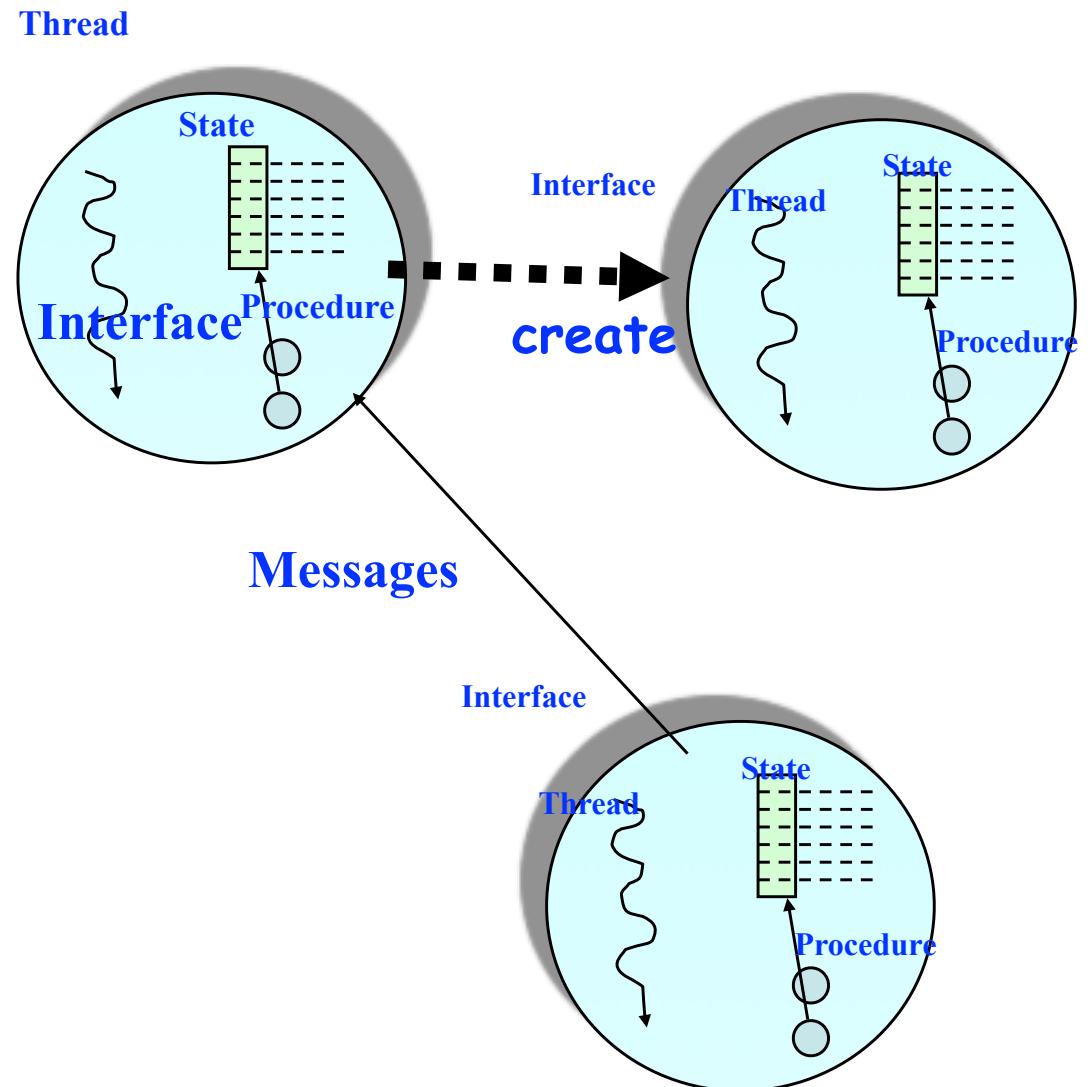
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- An actor is an autonomous, interacting component of a parallel system.
- An actor has:
  - an immutable identity (global reference)
  - a *single logical thread of control*
  - mutable local state (isolated by default)
  - procedures to manipulate local state (interface)



# The Actor Model: Fundamentals

- An actor may:
  - process messages
  - change local state
  - create new actors
  - send messages



# Actor Model

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- A message-based concurrency model to manage mutable shared state
  - First defined in 1973 by Carl Hewitt
  - Further theoretical development by Henry Baker and Gul Agha
- Key Ideas:
  - **Everything is an Actor!**
  - Analogous to “everything is an object” in OOP
  - Encapsulate shared state in Actors
  - Mutable state is not shared - i.e., no data races
- Other important features
  - Asynchronous message passing
  - Non-deterministic ordering of messages

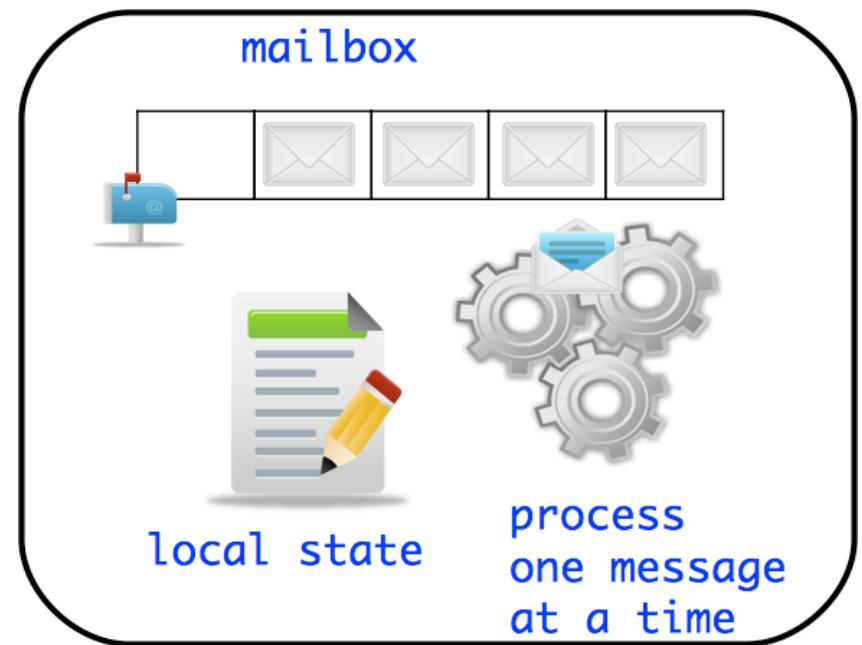


# Actor Life Cycle



## Actor states

- **New:** Actor has been created
  - e.g., email account has been created, messages can be received
- **Started:** Actor can process messages
  - e.g., email account has been activated
- **Terminated:** Actor will no longer processes messages
  - e.g., termination of email account after graduation



# Actor Analogy - Email

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- **Email accounts are a good simple analogy to Actors**
- **Account A2 can send information to account A1 via an email message**
- **A1 has a mailbox to store all incoming messages**
- **A1 can read (i.e. process) one email at a time**
  - At least that is what normal people do :)
- **Reading an email can change how you respond to a subsequent email**
  - e.g. receiving pleasant news while reading current email can affect the response to a subsequent email
- **Actor creation (stretching the analogy)**
  - Create a new email account that can send/receive messages



# Using Actors in HJlib

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- Create your custom class which extends `edu.rice.hj.runtime.actors.Actor<T>`, and implement the `void process()` method (type parameter T specifies message type)

```
class MyActor extends Actor<T> {  
    protected void process(T message) {  
        println("Processing " + message);  
    } }
```

- Instantiate and start your actor

```
Actor<Object> anActor = new MyActor();  
anActor.start()
```

- Send messages to the actor (can be performed by actor or non-actor)

```
anActor.send(aMessage); //aMessage can be any object in general
```

- Use a special message to terminate an actor

```
protected void process(Object message) {  
    if (message.someCondition()) exit();  
}
```

- Actor execution implemented as async tasks

Can use `finish` to await completion of an actor,  
if the actor is start-ed inside the `finish`.



# Summary of HJlib Actor API

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**void process(MessageType theMsg)** // Specification of actor's "behavior" when processing messages

**void send(MessageType msg)** // Send a message to the actor

**void start()** // Cause the actor to start processing messages

**void onPreStart()** // Convenience: specify code to be executed before actor is started

**void onPostStart()** // Convenience: specify code to be executed after actor is started

**void exit()** // Actor calls exit() to terminate itself

**void onPreExit()** // Convenience: specify code to be executed before actor is terminated

**void onPostExit()** // Convenience: specify code to be executed after actor is terminated

## // In Lecture 23

**void pause()** // Pause the actor, i.e. the actors stops processing messages in its mailbox

**void resume()** // Resume a paused actor, i.e. actor resumes processing messages in mailbox

See <http://www.cs.rice.edu/~vs3/hjlib/doc/edu/rice/hj/runtime/actors/Actor.html> for details



# Hello World Example

---

```
1. public class HelloWorld {  
2.     public static void main(final String[] args) {  
3.         finish(() -> {  
4.             EchoActor actor = new EchoActor();  
5.             actor.start(); // don't forget to start the actor  
6.             actor.send("Hello"); // asynchronous send (returns immediately)  
7.             actor.send("World"); // Non-actors can send messages to actors  
8.             actor.send(EchoActor.STOP_MSG);  
9.         });  
10.        println("EchoActor terminated.")  
11.    }  
12.    private static class EchoActor extends Actor<Object> {  
13.        static final Object STOP_MSG = new Object();  
14.        private int messageCount = 0;  
15.        protected void process(final Object msg) {  
16.            if (STOP_MSG.equals(msg)) {  
17.                println("Message- " + messageCount + ": terminating.");  
18.                exit(); // never forget to terminate an actor  
19.            } else {  
20.                messageCount += 1;  
21.                println("Message- " + messageCount + ": " + msg);  
21.            } } } }
```



# Integer Counter Example

## Without Actors:

```
1. int counter = 0;
2. public void foo() {
3.     // do something
4.     isolated(() -> {
5.         counter++;
6.     });
7.     // do something else
8. }
9. public void bar() {
10.    // do something
11.    isolated(() -> {
12.        counter--;
13.    });
14. }
```

- Can also use atomic variables instead of isolated construct

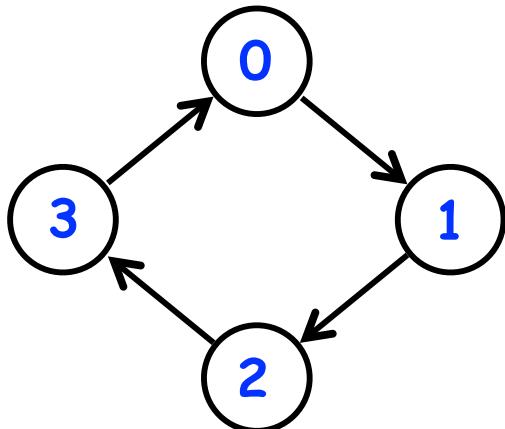
## With Actors:

```
15. class Counter extends Actor<Message> {
16.     private int counter = 0; // local state
17.     protected void process(Message msg) {
18.         if (msg instanceof IncMessage) {
19.             counter++;
20.         } else if (msg instanceof DecMessage) {
21.             counter--;
22.         }
23.     }
24.     Counter counter = new Counter();
25.     counter.start();
26.     public void foo() {
27.         // do something
28.         counter.send(new IncrementMessage(1));
29.         // do something else
30.     }
31.     public void bar() {
32.         // do something
33.         counter.send(new DecrementMessage(1));
34.     }
```



# ThreadRing (Coordination) Example

```
1. finish(() -> {
2.     int threads = 4;
3.     int numberOfHops = 10;
4.     ThreadRingActor[] ring =
5.         new ThreadRingActor[threads];
6.     for(int i=threads-1;i>=0; i--) {
7.         ring[i] = new ThreadRingActor(i);
8.         ring[i].start();
9.         if (i < threads - 1) {
10.             ring[i].nextActor(ring[i + 1]);
11.         }
12.     }
13.     ring[threads-1].nextActor(ring[0]);
14.     ring[0].send(numberOfHops);
15. });
16. // finish
```



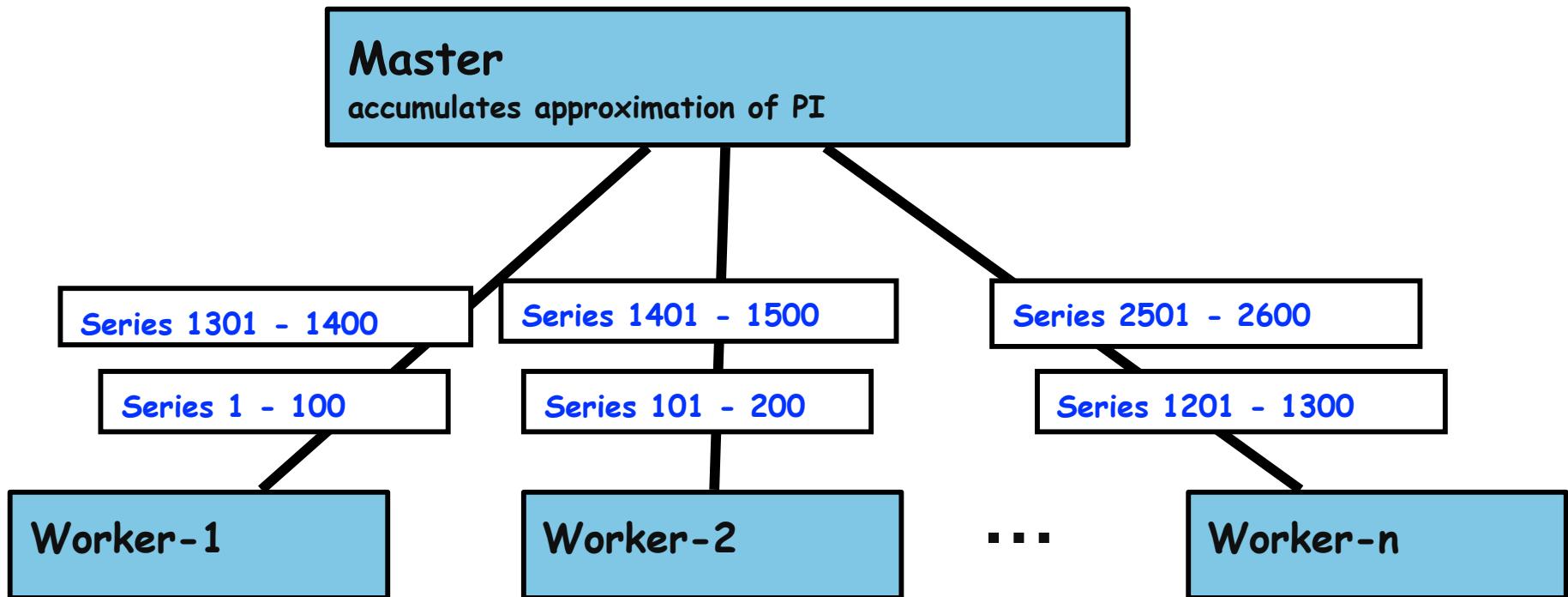
```
14. class ThreadRingActor
15.     extends Actor<Integer> {
16.     private Actor<Integer> nextActor;
17.     private final int id;
18.     ...
19.     public void nextActor(
20.         Actor<Object> nextActor) {...}
21.
22.     protected void process(Integer n) {
23.         if (n > 0) {
24.             println("Thread-" + id +
25.                 " active, remaining = " + n);
26.             nextActor.send(n - 1);
27.         } else {
28.             println("Exiting Thread-" + id);
29.             nextActor.send(-1);
30.         }
31.     }
32. }
```



# Pi Computation Example

$$\pi = 4 \sum_{k=0}^{\infty} \frac{(-1)^k}{2k+1} = \frac{4}{1} - \frac{4}{3} + \frac{4}{5} - \frac{4}{7} + \frac{4}{9} - \dots.$$

- Use Master-Worker technique:



Source: <http://www.enotes.com/topic/Pi>



# Pi Calculation --- Master Actor

---

```
1. class Master extends Actor<Object> {
2.     private double result = 0; private int nrMsgsReceived = 0;
3.     private Worker[] workers;
4.     Master(nrWrkrs, nrEls, nrMsgs) {...} // constructor
5.     protected void onPostStart() {
6.         // Create and start workers
7.         workers = new Worker[nrWrkrs];
8.         for (int i = 0; i < nrWrkrs; i++) {
9.             workers[i] = new Worker();
10.            workers[i].start();
11.        }
12.        // Send messages to workers
13.        for (int j = 0; j < nrMsgs; j++) {
14.            someWrkr = ... ; // Select worker for message j
15.            someWrkr.send(new Work(...));
16.        }
17.    } // start()
```



# Pi Calculation --- Master Actor (contd)

---

```
19.     protected void onPostExit() {
20.         for (int i = 0; i < nrWrkrs; i++)
21.             workers[i].send(new Stop());
22.     } // post-exit()
23.     protected void process(final Object msg) {
24.         if (msg instanceof Result) {
25.             result += ((Result) msg).result;
26.             nrMsgsReceived += 1;
27.             if (nrMsgsReceived == nrMsgs) exit();
28.         }
29.         // Handle other message cases here
30.     } // process()
31. } // Master
32. . . .
33. // Main program
34. Master master = new Master(w, e, m);
35. finish(() -> { master.start(); });
36. println("PI = " + master.getResult());
```



# Pi Calculation --- Worker Actor

---

```
1.  class Worker extends Actor<Object> {
2.      protected void process(final Object msg) {
3.          if (msg instanceof Stop)
4.              exit();
5.          else if (msg instanceof Work) {
6.              Work wm = (Work) msg;
7.              double result = calculatePiFor(wm.start, wm.end)
8.              master.send(new ResultMessage(result));
9.          } } // process()
10.
11.     private double calculatePiFor(int start, int end) {
12.         double acc = 0.0;
13.         for (int k = start; k < end; k++) {
14.             acc += 4.0 * (1 - (k % 2) * 2) / (2 * k + 1);
15.         }
16.         return acc;
17.     }
18. } // Worker
```

$$4 \sum_{k=S}^{e-1} \frac{(-1)^k}{2k+1}$$



# Worksheet #22: Interaction between finish and actors

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What output will be printed if the end-finish operation from slide 13 is moved from line 13 to line 11 as shown below? (Hint: see rule re. finish and actor start operations at bottom of slide 9.)

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



# BACKUP SLIDES START HERE

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# Limitations of Actor Model (move to Lec 23)

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- Deadlocks possible
  - Deadlock occurs when all started (but non-terminated) actors have empty mailboxes
- Data races possible when messages include shared objects
- Simulating synchronous replies requires some effort
  - e.g., does not support addAndGet()
- Implementing truly concurrent data structures is hard
  - No parallel reads, no reductions/accumulators
- Difficult to achieve global consensus
  - Finish and barriers not supported as first-class primitives

**==> Some of these limitations can be overcome by using a hybrid model that combines task parallelism with actors (more on this in the next lecture!)**



# Worksheet #20 solution: Parallel Spanning Tree Algorithm

---

1. Insert finish, async, and isolated constructs (pseudocode is fine) to convert the sequential spanning tree algorithm below into a parallel algorithm

See slide 3, as well as the `isolatedWithReturn()` API in slide 4 for convenience in implementing the pseudocode.

2. Is it better to use a global isolated or an object-based isolated construct for the parallelization in question 1? If object-based is better, which object(s) should be included in the isolated list?

Object-based isolation should be better with a singleton object list containing the “this” object for the `makeParent()` method.



# Parallel Spanning Tree Algorithm using object-based isolated construct

---

```
1. class V {
2.     V [] neighbors; // adjacency list for input graph
3.     V parent; // output value of parent in spanning tree
4.     boolean makeParent(final V n) {
5.         return isolatedWithReturn(this, () -> {
6.             if (parent == null) { parent = n; return true; }
7.             else return false; // return true if n became parent
8.         });
9.     } // makeParent
10.    void compute() {
11.        for (int i=0; i<neighbors.length; i++) {
12.            final V child = neighbors[i];
13.            if (child.makeParent(this))
14.                async((() -> { child.compute(); }));
15.        }
16.    } // compute
17. } // class V
18. . . .
19. root.parent = root; // Use self-cycle to identify root
20. finish((() -> { root.compute(); }));
21. . . .
```



# HJ isolatedWithReturn construct

---

// <body> must contain return statement

**isolatedWithReturn (obj1, obj2, ..., () -> <body> );**

**Motivation:** isolated() construct cannot modify local variables due to restrictions imposed by Java 8 lambdas

- Workaround 1: use isolated() and modify objects rather than local variables
  - Pro: code can be easier to understand than modifying local variables
  - Con: source of errors if multiple tasks read/write same object
- Workaround 2: use isolatedWithReturn()
  - Pro: cleaner than modifying local variables
  - Con: can only return one value



# java.util.concurrent.AtomicInteger methods and their equivalent object-based isolated constructs (Lecture 20)

j.u.c.atomic Class and Constructors	j.u.c.atomic Methods	Equivalent HJ isolated statements
AtomicInteger	int j = v.get(); v.set(newVal);	int j; isolated (v) j = v.val; isolated (v) v.val = newVal;
AtomicInteger() // init = 0	int j = v.getAndSet(newVal); int j = v.addAndGet(delta); int j = v.getAndAdd(delta);	int j; isolated (v) { j = v.val; v.val = newVal; } isolated (v) { v.val += delta; j = v.val; } isolated (v) { j = v.val; v.val += delta; }
AtomicInteger(init)	boolean b = v.compareAndSet (expect,update);	boolean b; isolated (v) if (v.val==expect) {v.val=update; b=true;} else b = false;

**Methods in java.util.concurrent.AtomicInteger class and their equivalent HJ isolated statements. Variable v refers to an AtomicInteger object in column 2 and to a standard non-atomic Java object in column 3. val refers to a field of type int.**



# Atomic Variables represent a special (and more efficient) case of Object-based isolation

---

```
1. class V {  
2.     V [] neighbors; // adjacency list for input graph  
3.     AtomicReference<V> parent; // output value of parent in spanning tree  
4.     boolean makeParent(final V n) {  
5.         // compareAndSet() is a more efficient implementation of  
6.         // object-based isolation  
7.         return parent.compareAndSet(null, n);  
8.     } // makeParent  
9.     void compute() {  
10.        for (int i=0; i<neighbors.length; i++) {  
11.            final V child = neighbors[i];  
12.            if (child.makeParent(this))  
13.                async(() -> { child.compute(); }); // escaping async  
14.        }  
15.    } // compute  
16. } // class V  
17. . . .  
18. root.parent = root; // Use self-cycle to identify root  
19. finish(() -> { root.compute(); });  
20. . . .
```

---



# Motivation for Read-Write Object-based isolation

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## Sorted List example

```
1. public boolean contains(Object object) {  
2.     // Observation: multiple calls to contains() should not  
3.     // interfere with each other  
4.     return isolatedWithReturn(this, () -> {  
5.         Entry pred, curr;  
6.         ...  
7.         return (key == curr.key);  
8.     });  
9. }  
10.  
11. public int add(Object object) {  
12.     return isolatedWithReturn(this, () -> {  
13.         Entry pred, curr;  
14.         ...  
15.         if (...) return 1; else return 0;  
16.     });  
17. }
```



# Read-Write Object-based isolation in HJ

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```
isolated(readMode(obj1),writeMode(obj2), ..., () -> <body> );
```

- Programmer specifies list of objects as well as their read-write modes for which isolation is required
- Not specifying a mode is the same as specifying a write mode (default mode = read + write)
- Mutual exclusion is only guaranteed for instances of isolated statements that have a non-empty intersection in their object lists such that one of the accesses is in writeMode
- Sorted List example

```
1. public boolean contains(Object object) {  
2.     return isolatedWithReturn( readMode(this), () -> {  
3.         Entry pred, curr;  
4.         ...  
5.         return (key == curr.key);  
6.     });  
7. }  
8.  
9. public int add(Object object) {  
10.    return isolatedWithReturn( writeMode(this), () -> {  
11.        Entry pred, curr;  
12.        ...  
13.        if (...) return 1; else return 0;  
14.    });  
15. }
```



# The world according to Module 1 without & with Phasers

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- All the non-phaser parallel constructs that we learned focused on task creation and termination
  - async** creates a task
    - **forasync** creates a set of tasks specified by an iteration region
  - finish** waits for a set of tasks to terminate
    - **forall** (like “**finish forasync**”) creates and waits for a set of tasks specified by an iteration region
  - future get()** waits for a specific task to terminate
  - asyncAwait()** waits for a set of DataDrivenFuture values before starting
- Motivation for phasers
  - Deterministic directed synchronization within tasks for barriers, point-to-point synchronization, pipelining
  - Separate from synchronization associated with task creation and termination
  - next operations are much more efficient than task creation/termination (**async/finish**), but they *only help reduce overhead if you perform multiple next operations in a task*



# Pipeline Parallelism: Another Example of Point-to-point Synchronization (Recap)

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- Medical imaging pipeline with three stages
  1. Denoising stage generates a sequence of results, one per image.
  2. Registration stage's input is Denoising stage's output.
  3. Segmentation stage's input is Registration stage's output.
- Even though the processing is sequential for a single image, *pipeline parallelism* can be exploited via point-to-point synchronization between neighboring stages



# Implementation of Medical Imaging Pipeline

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```
1. final List<PhaserPair> phList1 = Arrays.asList(ph0.inMode(PhaserMode.SIG));
2. final List<PhaserPair> phList2 = Arrays.asList(ph0.inMode(PhaserMode.WAIT), ph1.inMode(PhaserMode.SIG));
3. final List<PhaserPair> phList3 = Arrays.asList(ph1.inMode(PhaserMode.WAIT));
4.
5. asyncPhased(phList1, () -> { // DENOISE stage
6.     for (int i = 0; i < n; i++) {
7.         dowork(1);
8.         signal(); // same as ph0.signal(); as only ph0 is registered in this async
9.     }
10. });
11.
12. asyncPhased(phList2, () -> { // REGISTER stage
13.     for (int i = 0; i < n; i++) {
14.         ph0.dowait(); // WARNING: Explicit calls to dowait() can lead to deadlock in general
15.         dowork(1);
16.         ph1.signal();
17.     }
18. });
19.
20. asyncPhased(phList3, () -> { // SEGMENT stage
21.     for (int i = 0; i < n; i++) {
22.         ph1.dowait();
23.         dowork(1);
24.     }
25. });
```



# Announcements

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- Reminder: Quiz for Unit 4 is due today
- Reminder: Checkpoint #2 for Homework 3 is due by Wednesday, March 8th, and the entire homework is due by March 22nd
- The registrar has announced the schedule for the COMP 322 final exam:
  - 2-MAY-2017
  - 9:00AM - 12:00PM
  - Location TBD
- Scope of final exam (Exam 2) will be limited to Lectures 19 - 38



# Serialized Computation Graph for Isolated Constructs (Recap)

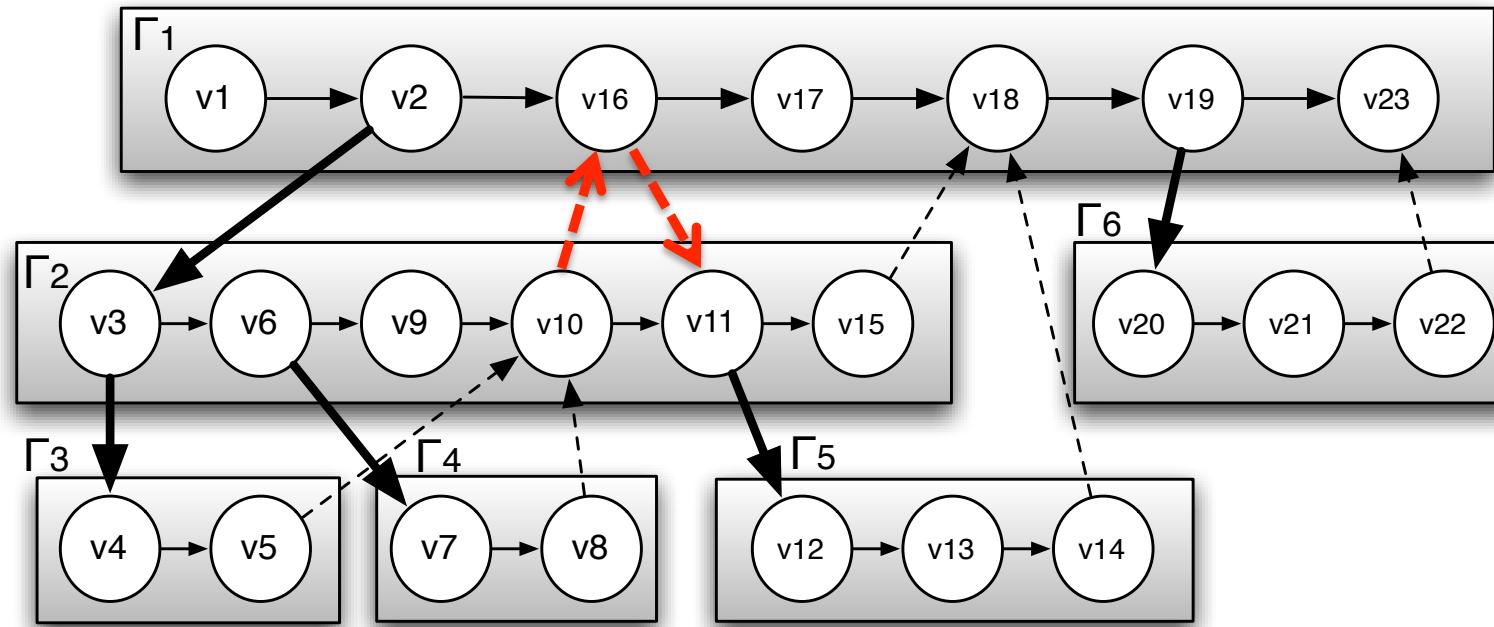
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- Model each instance of an isolated construct as a distinct step (node) in the CG.
- Need to reason about the *order* in which interfering isolated constructs are executed
  - Complicated because the order of isolated constructs may vary from execution to execution
- Introduce Serialized Computation Graph (SCG) that includes a specific ordering of all interfering isolated constructs.
  - SCG consists of a CG with additional serialization edges.
  - Each time an isolated step,  $S'$ , is executed, we add a serialization edge from  $S$  to  $S'$  for each prior “interfering” isolated step,  $S$ 
    - Two isolated constructs always interfere with each other
    - Interference of “object-based isolated” constructs depends on intersection of object sets
    - Serialization edge is not needed if  $S$  and  $S'$  are already ordered in CG
  - An SCG represents a set of schedules in which all interfering isolated constructs execute in the same order.



# Example of Serialized Computation Graph with Serialization Edges for v10-v16-v11 order (Recap)

Data race definition can be applied to Serialized Computation Graphs (SCGs) just like regular CGs



→ Continue edge      → Spawn edge      - - - → Join edge

— → **Serialization edge**

v10: isolated { x ++; y = 10; }  
v11: isolated { x++; y = 11; }  
v16: isolated { x++; y = 16; }

- Need to consider all possible orderings of interfering isolated constructs to establish data race freedom





# BACKUP SLIDES START HERE

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