# Java for High Performance Computing: Assessment of Current Research and Practice

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7th Intl. Conf. Principles and Practice of Programming in Java (PPPJ'09), University of Calgary, Alberta, Canada





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### 5 Conclusions

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Java for HPC

# Java is an Alternative for HPC in the Multi-core Era

#### Interesting features:

- Built-in networking
- Built-in multi-threading
- Portable, platform independent
- Object Oriented
- Main training language

Many productive parallel/distributed programming libs:

- Java shared memory programming (high level facilities: Concurrency framework)
- Java Sockets
- Java RMI
- Message-Passing in Java (MPJ) libraries

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# Java Adoption in HPC

- HPC developers and users usually want to use Java in their projects.
- Java code is no longer slow (Just-In-Time compilation)!
- But still performance penalties in Java communications:

### Pros and Cons:

- high programming productivity.
- but they are highly concerned about performance.

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# Java Adoption in HPC

- HPC developers and users usually want to use Java in their projects.
- Java code is no longer slow (Just-In-Time compilation)!
- But still performance penalties in Java communications:

#### **JIT Performance:**

- Like native performance.
- Java can even outperform native languages thanks to the dynamic compilation.

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# Java Adoption in HPC

- HPC developers and users usually want to use Java in their projects.
- Java code is no longer slow (Just-In-Time compilation)!
- But still performance penalties in Java communications:

### High Java Communications Overhead:

- Poor high-speed networks support.
- The data copies between the Java heap and native code through JNI.
- Costly data serialization.
- The use of communication protocols unsuitable for HPC.

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### **Emerging Interest in Java for HPC**

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TUESDAY SEPTEMBER 02, 2008 Current State of Java for HPC At the last jon One I do a wilk on tak doing the AND haynote when I talked about how incredible tetiopers tractile for fortune Attenues of the AND haynote when I talked about how incredible tetiopers tractile for fortune Attenues (Det Mark Complexity in the AND haynote when I talked about how incredible tetiopers tractile for fortune Attenues (Det Mark Complexity in the AND haynote when I talked about how incredible tetiopers tractile for fortune Attenues (Det Mark Complexity interesting reading). There are a lot of HPC micro benchmarks in it which look great. Thankst Permatric Comments [3]	E Fallacies bio Standards BOOKS WORTH READING
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### Current State of Java for HPC

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### Current options in Java for HPC:

- Java Shared Memory Programming
- Java Sockets
- Java RMI
- Message-Passing in Java (MPJ)



### Java Shared Memory Programming:

- Java Threads
- Concurrency Framework (ThreadPools, Tasks ...)
- Parallel Java (PJ)
- Java OpenMP (JOMP and JaMP)



### Listing 1: JOMP example

```
public static void main (String argv[]) {
    int myid;
    //omp parallel private(myid)
    {
        myid = OMP.getThreadNum();
        System.out.println(''Hello from'' + myid);
    }
    //omp parallel for
    for (i=1;i<n;i++) {
        b[i] = (a[i] + a[i-1]) * 0.5;
    }
}</pre>
```

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### Java Communication Libraries Overview

Java HPC Applications

Java Message-passing libraries

Java RMI / Low-level messaging libraries

Java Sockets libraries

HPC Communications Hardware

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### **HPC** Communications Hardware

Performance of current HPC networks (Theoretical/C/Java):

	Startup latency	Bandwidth
	(microseconds)	(Mbps)
Gig. Ethernet	50/55/60	1000/920/900
10G Ethernet	5/10/50	10000/9000/5000
10G Myrinet	1/2/30	10000/9300/4000
InfiniBand	1/2/20	16000/12000/6000
SCI	1.4/3/50	5333/2400/800

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Standard and widely extended low-level programming interface for networked communications.

Current implementations:

- IO sockets
- NIO sockets
- Ibis sockets
- Java Fast Sockets

Pros and Cons:

- easy to use.
- but only TCP/IP support.
- lack non-blocking communication.

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Current implementations:

- IO sockets
- NIO sockets
- Ibis sockets
- Java Fast Sockets

### Pros and Cons:

- provides non-blocking communication.
- but only TCP/IP support.
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- o difficult use.

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Standard and widely extended low-level programming interface for networked communications.

Current implementations:

- IO sockets
- NIO sockets
- Ibis sockets
- Java Fast Sockets

Pros and Cons:

- easy to use.
- with Myrinet support.
- but lack non-blocking communication.

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Iack HPC tailoring.

### Java Sockets

Standard and widely extended low-level programming interface for networked communications.

Current implementations:

- IO sockets
- NIO sockets
- Ibis sockets
- Java Fast Sockets

### Pros and Cons:

- easy to use.
- efficient high-speed networks support.

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- efficient shared memory protocol.
- with HPC tailoring.
- but lack non-blocking support.

## **Remote Method Invocation**

#### RMI (Remote Method Invocation)

- Widely extended
- RMI-based middleware (e.g., ProActive)
- RMI Optimizations:
  - KaRMI
  - Manta
  - Ibis RMI
  - Opt RMI

### Java Message-Passing Libraries

### Message-passing is the main HPC programming model.

 Implementation approaches in Java message-passing libraries.

### Implementation approaches

- RMI-based.
- Wrapping a native library (e.g., MPI libraries: OpenMPI, MPICH).

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Sockets-based.

### Listing 2: MPJ example

```
import mpi.* ;
public class Hello {
  public static void main (String argv[]) {
    MPI. Init(args);
    int rank = MPI.COMM WORLD.Rank();
    if (rank == 0)
      String[] msg = new String[1];
      msa[0] = new String("Hello"):
      MPLCOMM WORLD, Send (msg. 0, 1, MPLOBJECT, 1, 13);
    } else if (rank == 1) {
      String[] message = new String[1];
      MPI.COMM WORLD. Recv (message, 0, 1, MPI.OBJECT, 0, 13);
      System.out.println(message[0]);
    MPL. Finalize() :
```

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Jcluster	$\checkmark$	$\checkmark$							$\checkmark$		
Parallel Java	$\checkmark$	$\checkmark$							$\checkmark$		
mpiJava				$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$				
P2P-MPI	$\checkmark$	$\checkmark$	$\checkmark$				$\checkmark$				
MPJ Express	$\checkmark$		$\checkmark$	$\checkmark$			$\checkmark$				
MPJ/Ibis	$\checkmark$	$\checkmark$		$\checkmark$				$\checkmark$			
JMPI	$\checkmark$	$\checkmark$							$\checkmark$		
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### Java Communication Libraries Overview

Java HPC Applications (Develop Efficient Codes)

Java Message-passing libraries (Scalable Algorithms)

Low-level messaging libraries (MPJ Devices)

Java Sockets libraries (Java Fast Sockets)

### **HPC Hardware**

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# Java Fast Sockets (JFS)

#### High Performance Java Fast Sockets (JFS):

- Provides efficient high-speed cluster interconnects support (SCI, Myrinet and InfiniBand).
- Optimizes Java IO sockets, more popular and extended than NIO sockets.
- Avoids the need for primitive data type array serialization.
- Significantly reduces buffering and unnecessary copies.
- Implements an optimized shared memory protocol.
- It is user and application transparent, no source code modification is necessary to use JFS.

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# JFS Transparency

SocketImplFactory factory = **new** jfs.net.JFSImplFactory(); Socket.setSocketImplFactory(factory); ServerSocket.setSocketFactory(factory);

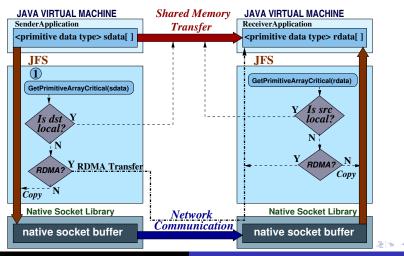
```
Class cl = Class.forName(className);
Method method = cl.getMethod("main",parameterTypes);
method.invoke(null, parameters);
```

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# JFS optimized protocol



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### JFS Serialization Avoidance Feature

#### JFS extended API for communicating primitive data type arrays directly.

```
jfs.net.SocketOutputStream.write(byte buf[], int offset, int length);
jfs.net.SocketOutputStream.write(int buf[], int offset, int length);
jfs.net.SocketOutputStream.write(double buf[], int offset, int length);
...
jfs.net.SocketInputStream.read(byte buf[], int offset, int length);
jfs.net.SocketInputStream.read(int buf[], int offset, int length);
jfs.net.SocketInputStream.read(double buf[], int offset, int length);
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```

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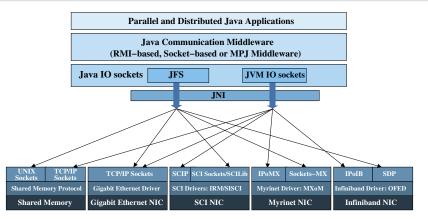
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JFS Portability and Performance (direct send of part of an integer array)

```
int int_array[] = new int[20];
// Writing the first ten elements of int_array
if (os instanceof jfs.net.SocketOutputStream) {
    ((jfs.net.SocketOutputStream) os).write(int_array,0,10);
else {
    int[] ints = (int[]) Array.newInstance(int.class, 10);
    System.arraycopy(int_array, 0, ints, 0, 10);
    oos = new ObjectOutputStream(os);
    oos.writeUnshared(ints);
}
```

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# JFS High-speed Networks Support



# Figure: Java communication middleware on high-speed multi-core clusters

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# JFS Micro-Benchmarking

JFS performance improvement compared to Sun JVM sockets

	JFS start-up	JFS bandwidth		
	reduction	increase		
SCI	up to 88%	up to 1305%		
Myrinet	up to 78%	up to 412%		
InfiniBand	up to 65%	up to 860%		
Gigabit Ethernet	up to 10%	up to 119%		
Shared memory	up to 50%	up to 4411%		

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JFS Java Communication Devices MPJ Collectives Scalability HPC Benchmarking

# iodev: Low-level Message-Passing Library

The use of pluggable low-level communication devices is widely extended in message-passing libraries.

### Message-passing Low-level Devices:

- MPICH/MPICH2 ADI/ADI3 (GM/MX for Myrinet, IBV/VAPI for InfiniBand, and shared memory).
- OpenMPI BTL (GM/MX for Myrinet, IBV/VAPI for InfiniBand, and shared memory).
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### xxdev API. Public interface of the xxdev. Device class

```
public abstract class Device {
 static public Device newInstance(String deviceImpl);
public int[] init(String[] args);
public int id();
public void finish();
public Request isend(Object buf, int dst, int tag);
public Request irecv(Object buf, int src, int tag, Status stts);
public void send(Object buf, int dst, int tag);
public Status recv(Object buf, int src, int tag);
public Request issend(Object buf, int dst, int tag);
public void ssend(Object buf, int dst, int tag);
public Status iprobe(int src, int tag, int context);
public Status probe(int src, int tag, int context);
public Request peek();
```

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## Low-Level Java Communication Devices

#### xdev implementations

- Current: niodev (Java NIO sockets), iodev (Java IO sockets, and hence JFS) and mxdev (Myrinet)
- Ongoing: smpdev (Shared memory) and ibdev (InfiniBand)

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# Fast MPJ (F-MPJ)

Fast MPJ (F-MPJ) is the scalable and efficient Java message-passing library implemented on top of the low-level message-passing middleware iodev.

### F-MPJ:

- shows efficient non-blocking communication (iodev) and high-speed multi-core clusters support (JFS).
- presents lower communication overhead through an extensive use of communications overlapping.
- achieves high scalability as it implements several algorithms per collective primitive, allowing their selection at runtime.

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## **MPJ** Collective Algorithms

The design, implementation and runtime selection of efficient collective communication operations have been extensively discussed in the context of native message-passing libraries, but not in MPJ.

F-MPJ focuses on developing scalable MPJ collective primitives.

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F-MPJ focuses on developing scalable MPJ collective primitives.

#### **Collective Algorithms:**

- Flat Tree (FT)
- Minimum-Spanning Tree (MST)
- Binomial Tree (BT)

- Four-ary Tree (Four-aryT)
- Bucket (BKT) or cyclic
- BiDirectional Exchange (BDE) or recursive doubling

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# MPJ Collective Algorithms. MST



Figure: Minimum-spanning tree algorithm for Broadcast

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# MPJ Collective Algorithms. BKT

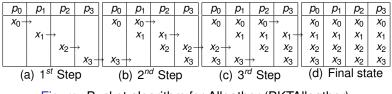


Figure: Bucket algorithm for Allgather (BKTAllgather)

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# MPJ Collective Algorithms. BDE

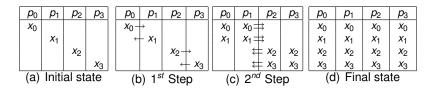


Figure: Bidirectional exchange algorithm for Allgather (BDEAllgather). In the  $2^{nd}$  step, bidirectional exchanges occur between the two pairs of processes  $p_0$  and  $p_2$ , and  $p_1$  and  $p_3$ 

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Collective	F-MPJ	MPJ Express	
Barrier	MST	nbFTGather+ bFour-aryTBcast	
Bcast	MST <sup>1</sup>	bFour-aryT	
	MSTScatter+BKTAllgather <sup>2</sup>		
Scatter	MST	nbFT	
	nbFT <sup>2</sup>		
Scatterv	MST	nbFT	
	nbFT <sup>2</sup>		
Gather	MST	nbFT	
	nbFT <sup>2</sup>		
Gatherv	MST	nbFT	
	nbFT <sup>2</sup>		
Allgather	MSTGather+MSTBcast <sup>1</sup>	nbFT	
	BKT <sup>2</sup> / BDE <sup>3</sup>		
Allgatherv	MSTGatherv+MSTBcast	nbFT	
Alltoall Alltoallv	nbFT nbFT	nbFT nbFT	
Reduce	MST <sup>1</sup>	bFT	
neuuce	BKTReduce scatter+	011	
	MSTGather <sup>2</sup>		
Allreduce	MSTReduce+MSTBcast <sup>1</sup>	BT	
	BKTReduce_scatter+		
	BKTAllgather <sup>2</sup> / BDE <sup>3</sup>		
Reduce	MSTReduce+MSTScatterv <sup>1</sup>	bFTReduce+	
scatter	BKT <sup>2</sup> / BDE <sup>3</sup>	nbFTScatterv	
Scan	nbFT	nbFT	

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## NPB-MPJ Characteristics (10,000 SLOC (Source LOC))

Name	Operation	SLOC	Communicat. intensiveness	Kernel	Applic.
CG EP	Conjugate Gradient	1000	Medium	$\checkmark$	
EP	Embarrassingly Parallel	350	Low	$\checkmark$	
FT	Fourier Transformation	1700	High	$\checkmark$	
IS	Integer Sort	700	High	$\checkmark$	
MG	Multi-Grid	2000	High	$\checkmark$	
SP	Scalar Pentadiagonal	4300	Medium		$\checkmark$

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# NPB-MPJ

### NPB-MPJ Optimization:

- JVM JIT compilation of heavy and frequent methods with runtime information
- Structured programming is the best option
  - Small frequent methods are better.
    - mapping elements from multidimensional to one-dimensional arrays (array flattening technique: arr3D[x][y][z]→arr3D[pos3D(lenghtx,lengthy,x,y,z)])
  - NPB-MPJ code refactored, obtaining significant improvements (up to 2800% performance increase)

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Experimental Configuration Java Performance for HPC

## **Experimental Configuration:**

#### Departmental cluster (8 nodes)

- Intel Xeon 5060 dual dual-core CPU (4 cores with hyper-threading per node)
- 4 GB RAM
- InfiniBand network (16 Gbps)
- Linux, OFED-1.4, Intel MPI/C Compiler
- Sun JDK 1.6, ProActive, F-MPJ, MPJ Express, mpiJava

#### 24-core machine

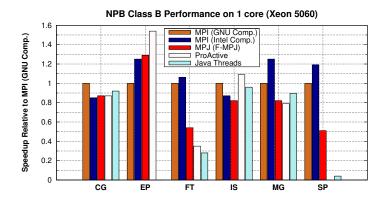
- Quad Intel Xeon 7450 hexa-core CPU (24 cores)
- 32 GB RAM
- Linux, Sun JDK 1.6, Intel Open Compiler

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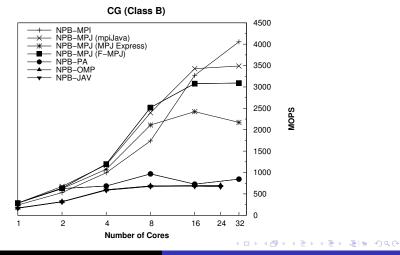
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# Experimental Results on One Core (relative perf.)



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## **NPB-MPJ** Performance

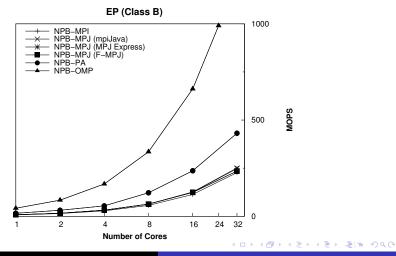


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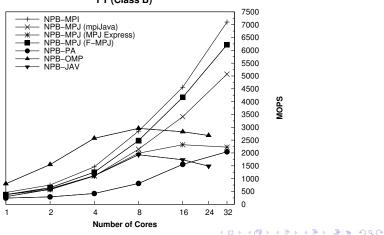
## **NPB-MPJ** Performance



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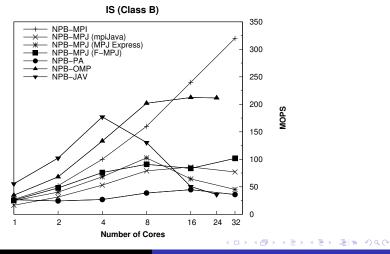


FT (Class B)

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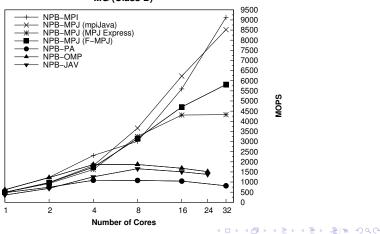
## **NPB-MPJ** Performance



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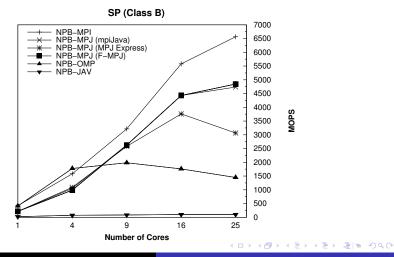


MG (Class B)

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## **NPB-MPJ** Performance



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# Finis Terrae Supercomputer Configuration

#### Finis Terrae (142 HP Integrity rx7640 nodes).

Hybrid shared/distributed memory (up to 8 cores per node and up to 32 nodes).

- 16 Montvale Itanium2 (IA64) cores at 1.6 GHz (used 8 cores per node).
- 128 GB RAM
- Interconnected via InfiniBand (16 Gbps)

#### Finis Terrae Integrity Superdome

Shared memory performance evaluation of up to 64 cores:

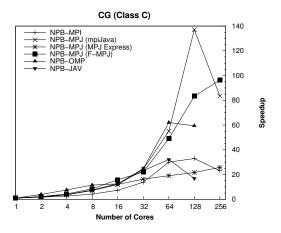
- 128 Montvale Itanium2 (IA64) cores at 1.6 GHz
- 1 TB RAM

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Conclusions

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# NPB-MPJ Performance Evaluation (Finis Terrae)

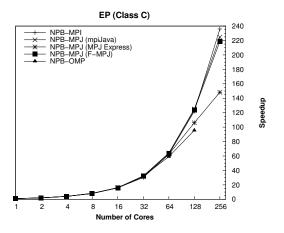


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# NPB-MPJ Performance Evaluation (Finis Terrae)



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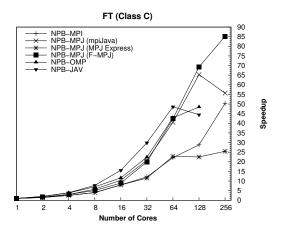
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# NPB-MPJ Performance Evaluation (Finis Terrae)



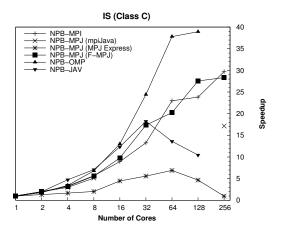
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# NPB-MPJ Performance Evaluation (Finis Terrae)



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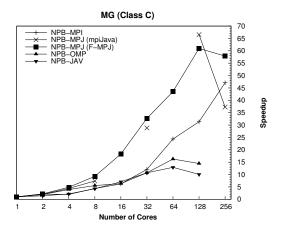
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# NPB-MPJ Performance Evaluation (Finis Terrae)

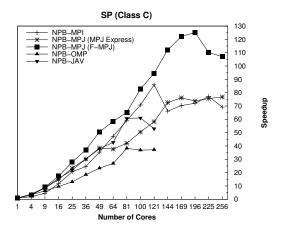


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# NPB-MPJ Performance Evaluation (Finis Terrae)



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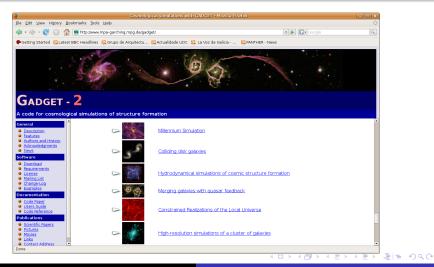
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## Gadget Cosmological Simulation Project Webpage

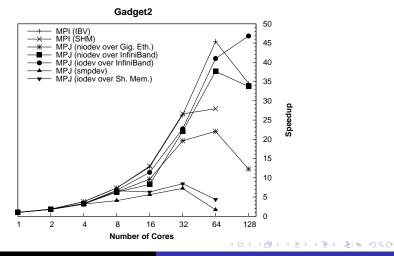


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# Gadget Cosmological Simulation Speedup



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Summary Questions

## Summary

- Current state of Java for HPC (interesting/feasible alternative)
- Available programming models in Java for HPC:
  - Shared memory programming
  - Distributed memory programming
  - Distributed shared memory programming
- Active research on Java for HPC (>30 projects)
- ...but still not a mainstream language for HPC
- Adoption of Java for HPC:
  - It is an alternative for programming multi-core clusters (tradeoff some performance for appealing features)
  - Performance evaluations are highly important
  - Analysis of current projects (promotion of joint efforts)

Summary Questions

## **Questions?**

JAVA FOR HIGH PERFORMANCE COMPUTING:

### ASSESSMENT OF CURRENT RESEARCH AND PRACTICE

PPPJ'09

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G. L. Taboada\*, J. Touriño, R. Doallo Java for HPC: Assessment of Current Research and Practice

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# For Further Reading I

- G. L. Taboada, and J. Touriño, and R. Doallo, "Java Fast Sockets: Enabling High-speed Java Communications on High Performance Clusters," *Computer Communications*, vol. 31, no. 17, pp. 4049–4059, 2008.
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- G. L. Taboada, J. Touriño, and R. Doallo, "Performance Analysis of Message-Passing Libraries on High-Speed Clusters," *Intl. Journal of Computer Systems Science & Engineering*, 2009 (In press).

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# For Further Reading II

- B. Amedro, V. Bodnartchouk, D. Caromel, C. Delbé, F. Huet, and G. L. Taboada. "Current State of Java for HPC", *INRIA Technical Report RT-0353*, pages 1–24, INRIA Sophia Antipolis, Nice, France, 2008, http://hal.inria.fr/inria-00312039/en/
- A. Shafi, B. Carpenter, and M. Baker. "Nested Parallelism for Multi-core HPC Systems using Java", *Journal of Parallel and Distributed Computing*, 2009 (In press).
- A. Shafi, B. Carpenter, M. Baker, and A. Hussain. "A Comparative Study of Java and C Performance in two Large-scale Parallel Applications", .*Concurrency and Computation: Practice and Experience*, In press, 2009.

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#### **RMI Layers:**

• Transport Protocol Optimization.

- Serialization
   Overhead Reduction.
- Object Manipulation Improvements.

### Optimization:

- High Performance Sockets Support (JFS).
- Reduction of Data Block Information.

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### **RMI Layers:**

- Transport Protocol Optimization.
- Serialization Overhead Reduction.
- Object Manipulation Improvements.

### Optimization:

• Native Array Serialization.

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#### **RMI Layers:**

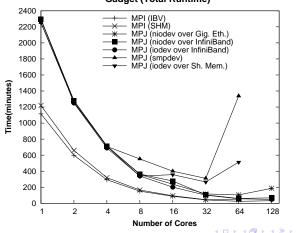
- Transport Protocol Optimization.
- Serialization Overhead Reduction.
- Object Manipulation Improvements.

### **Optimization:**

- Versioning Information Reduction.
- Class Annotation Reduction.
- Array Processing Improvements.

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# Gadget Cosmological Simulation Runtime



#### Gadget (Total Runtime)

G. L. Taboada\*, J. Touriño, R. Doallo

Java for HPC: Assessment of Current Research and Practice

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