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Design of the Kan Distributed Object System

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Abstract

Distributed software problems are often addressed with object-oriented solutions. Objects provide the benefits of encapsulation and abstraction that have proven useful in managing the complexity of sequential code. However, the management of distributed objects is typically by means of complex APIs, such as CORBA, DCOM, or Java RMI. The complexity of the APIs is itself a hurdle to the writing of efficient, robust programs. An alternate approach is to provide the programmer with a simple interface to an underlying object management layer that provides efficient access to objects and sufficient power for common distributed programming tasks.

This paper describes the implementation of the Kan system. It has a clear, simple object model with powerful semantics, embodying such concepts as atomic transactions, asynchronous method calls, and multithreading. The model primitives help the programmer avoid common concurrent programming errors, allowing clean expressions of concurrent algorithms. Kan provides *distributed* objects (i.e., objects that can migrate or be replicated), rather than the *remote* objects of Java RMI. Nevertheless, Kan optimizations provide runtime object accesses that are as efficient as or more efficient than accesses made to a similar distribution control layer over Java RMI. We describe the optimizations and measure their runtime impacts.

1 Introduction

Distributed systems are increasingly ubiquitous, both due to an ever greater need for computational power and because many applications are inherently distributed. Airline reservation systems are an example of the latter, since the travel agents who use such systems are themselves widely distributed geographically. Modern computing systems must cope with the challenges presented by widely distributed systems, such as asynchrony, large and unstable network latencies, heterogeneous computing nodes, congestion, network failures and partitions, computer failures, and security issues. Furthermore, the increased complexity of software and applications is blurring the traditional boundaries between application domains such as databases, distributed computing, and parallel computing. The same user program needs to manipulate shared information consistently, migrate and access distributed resources, and perform its tasks in a concurrent and efficient way.

Part of the difficulty with programming distributed systems lies in the complexity of the software itself. Software that copes with all of the above challenges tends to be large and complex. Many have chosen object-oriented technology as the answer. For example, commercial distributed applications commonly use the OMG's CORBA [\[32\]](#page-39-0) or Microsoft's DCOM [\[10\]](#page-37-0) to provide interoperability between distributed system

Figure 1: Kan System Structure

services and clients written on different platforms, and even with different programming languages. Objects provide the benefits of encapsulation and abstraction that have proven useful in managing the complexity of sequential code. Java solutions to distributed problems are largely based on [RMI](http://java.sun.com/products/jdk/rmi/) (Java's Remote Method Invocation API), which provides RPC-style access to objects at fixed locations.

An alternative to large, complex APIs is a simple, powerful interface to an object management layer that provides efficient object access. This paper describes the Kan¹ system, a step in that direction. Kan programs are written in a language that extends Java [\[15\]](#page-37-1) with a few simple keywords, providing access to such features as asynchronous method calls (used for expressing concurrency), guards (used for expressing dataflow and synchronization constraints), and nested atomic transactions [\[28,](#page-38-0) [29\]](#page-38-1) (used for expressing atomicity). It hides distribution, replication, migration, and faults from the programmer. The model is designed to significantly reduce programming errors caused by incorrect thread synchronization and invalid object consistency. The programmer is freed from the burden of managing object migration, replication and thread migration. The resulting *network transparency* allows the programmer to concentrate on algorithms instead of the details of placing and finding objects. The programmer's view is that of a global namespace in which objects are accessed by concurrent threads. Preserving this simplicity while maintaining efficiency through runtime monitoring is our principal objective.

The Java language provides us with the ability to write multithreaded applications. However, it is not entirely appropriate for programming distributed systems. For example, Brose, Löhr, and Spiegel show [\[8,](#page-37-2) [9\]](#page-37-3) that Java's method-calling semantics, pass-by-value, lead to unacceptable latencies when accessing arrays, and even class instances. They also show that RMI does not solve the problem. Java, even with RMI, does not exhibit access transparency, or identical method calling syntax and semantics for both local and remote objects. Our design allows the programmer to think in terms of nondistributed and distributed, rather than local and remote. The benefit is that the desired scope of an object is generally clear from the program design. For example, user interface objects are nondistributed (or have local scope), since they must interact with the hardware of the computer which the user is operating. However, data containers are distributed (or have global scope), since they must be shared to provide the desired utility.

The basic structure of the Kan system is shown in Figure [1.](#page-2-1) A source file, using our distributed programming constructs, is passed to the Kan compiler. The compiler produces standard Java bytecode, containing calls into the Kan runtime system. That system itself is written in pure Java, so the system and user applications will all run on any standard Java Virtual Machine, using Java sockets for communication. Kan

¹The word *Kan* is Sanskrit for a small particle, an atom or molecule.

includes several optimizations, including thread pools, thread inlining, pointer swizzling, object replication, and object migration. With these optimizations, Kan is able to outperform an RMI-based system that uses structures of similar complexity to manage distributed objects.

The rest of the paper is organized as follows. In Section [2](#page-3-0) we describe our object-oriented model of distributed computing. Relevant architectural information for Kan is presented in Section [3,](#page-8-0) along with a rationale for the design decisions. In Section [4,](#page-12-0) we show the results of our performance testing on Kan, and describe various optimizations used to enhance that performance. We compare Kan's performance to that of RMI when using data structures of similar complexity to model the effects of supporting distributed, rather than remote, objects. We discuss related work in Section [5.](#page-33-0) Finally, we close with discussions of future extensions to Kan in Section [6.](#page-36-0)

2 The Kan Object Model and Language

The Kan object model is similar to other concurrent object models, such as those of Orca [\[3\]](#page-37-4) and Java [\[24\]](#page-38-2). It includes notions of *object*, *class*, *method*, and *thread* that are similar to those appearing in the definitions of such languages as Java and C_{++} [\[38\]](#page-39-1). The Kan programming language itself is Java, with the extensions described in the rest of this section.

2.1 Asynchronous method call

Parallelism in Java programs is expressed via threads; a new thread is added to the system by creating a java.lang.Thread object. Java threads cannot be transferred between JVMs, however. They contain native code stacks which can hold native pointers into the heap. Hence, we provide similar functionality in Kan with implicit thread creation via asynchronous method calls. Such calls return an explicit *future*, similar to those used in ABCL/f [\[47\]](#page-39-2), for example. This is an object that can be used to *join* with the new thread, to test for completion of the called method, and to fetch return values or rethrow exceptional return values. The synchronous method calls with which most programmers are familiar are equivalent to an asynchronous call followed immediately by a join with the forked thread. This equivalence is exploited in our language design.

The *asynch* keyword is written after a method call to indicate that the call should be made asynchronously (see the example in Figure [2](#page-4-0) below). In such cases, a Future object is returned to the caller. The future can be used to determine when the called method has completed execution, and to retrieve return values and exceptional results. Method calls without this keyword are made synchronously, as with normal Java method calls. Note that the Future objects are *magic*, in that they receive special compiler support. The compiler looks up the return type and declared exceptions of the invoked method, and constructs a result method that returns the correct type and throws only those exceptions. Kan thus cooperates with Java's type and exception checking mechanisms.

Method parameters are always passed by value, as in local Java semantics. In particular, since variables of object type store references, then objects are passed by reference, whether the called object is local or remote. That is, there is no local/remote distinction in the model. This ensures that all method calls have a uniform semantics, thereby avoiding the pitfalls identified by Brose, Löhr, and Spiegel [\[8,](#page-37-2) [9\]](#page-37-3).

Consider the example code in Figure [2.](#page-4-0) It sends several values to an adder (or accumulator) asynchronously, then waits to be sure each call has completed. The add methods return the new value in the adder after the addition. The program ends by fetching the number returned by the third add operation. Note that the result fetching assumes that the third thread spawned executes last. This might not be the case; asynchronous calls are unordered, so code that assumes a FIFO ordering may not execute as expected. In particular, in this example, the third thread (corresponding to future f_3) may execute *first*. The right approach is to query the Adder object ^a for its final value after the add operations have been joined; e.g.,

Figure 2: Model example: adding integers x , y , and z

 $result = a \text{ val}()$:

Asynchronous method calls can be used to express the parallelism in distributed and parallel applications. We have found them useful in expressing such applications as a parallel Sieve of Eratosthenes and a distributed web cache, among others. The sieve application divides the range of numbers to sieve among a set of nodes. It then uses asynchronous method calls to fork off one thread per node. Each thread sieves over its selected range, and all higher ranges. In this way, the asynchronous method calls capture the parallelism inherent in this application.

2.2 Guarded Atomic Actions (Transactions)

Synchronization in Java is achieved with the synchronized keyword. However, synchronized corresponds to an exclusive lock; shared locks are important in distributed systems for performance reasons. In addition, this keyword corresponds to lock acquisition only. Kan includes a more powerful guarded atomic action construct. The guard is a predicate, or boolean expression, over the states of the executing thread and the associated object (i.e., *this*). A guard may be evaluated multiple times before it is found to be satisfied, so it should be free of side effects; however, Kan does not currently enforce this restriction.

Each guard is associated with a block of code that is executed as a transaction in a state satisfying the guard. Guards are useful for expressing dataflow synchronization requirements. The most common idiom for programming dataflow synchronization expressions in Java is to insert a while loop that tests for the condition, wrapped around a wait. Then, anywhere that the condition becomes true (or *might* become true), a notify is issued (or, if the number of waiting threads might be greater than one, a notifyAll is issued). If the programmer forgets a single notify, some threads may wait forever, leading to lack of progress at runtime. If the programmer forgets a single wait, the program can be incorrect, due to executing critical code when the condition is not satisfied. In Kan, the programmer does not have to worry about where the condition becomes true. The programmer just marks off regions of code where interference might be a problem, and writes dataflow synchronization and mutual exclusion requirements into the guard. This significantly reduces opportunities for intermittent, difficult to debug synchronization errors.

The guard in our model plays much the same role as in Owicki and Gries' system [\[33\]](#page-39-3), ensuring that the local state meets some criterion before the following atomic step takes place. However, our construction differs from their **await B then** ^S construction in allowing method calls inside an atomic step. Like Owicki and Gries, we assume that each transaction is terminating, as a non-terminating atomic action can never have any visible effect on the system state. The guard construct also bears a close relation to that of Orca [\[4\]](#page-37-5), the key difference being that Orca allows a thread to wait on multiple guards, nondeterministically selecting one if more than one is satisfied. It is also similar to the dataflow synchronization structure of Distributed Oz [\[40\]](#page-39-4).

The *guard* keyword is used to mark a block of code as containing an atomic transaction, and to block execution of that transaction until a boolean predicate is satisfied. The boolean predicate must be over the local state of the thread and the fields of the object. Since a guard may be evaluated multiple times, the programmer should ensure that it does not change the state of any object. However, Kan does not enforce

```
public class Account {
    public void transfer (float amt; Account toAccount)
        throws InsufficientFundsException {
        guard (true) {
            Future f = toAccount \text{ deposit} (amt) asynch;
            withdraw (amt) ;
            f join();
        }
    }
}
```
Figure 3: Transfer funds

this restriction at the present time.

We have found guards to be a powerful and useful construct for expressing dataflow synchronization constraints in a distributed whiteboard. In the whiteboard, a shared space can be drawn upon by each participant. The task of the application is to show each participant an up-to-date view of the shared space. One thread on each computing node acts as an observer. In effect, it computes a snapshot of the shared space, then suspends itself on a guard that asserts that the state of the object does not correspond to its snapshot. When that assertion becomes true, it indicates that the shared space has changed state. Therefore, the awakened thread updates the displayed view of the shared region, then repeats the action of taking a snapshot and waiting for another change to the shared space.

2.3 Nested atomic action (nested transaction)

Sometimes more than one object must be accessed in the same atomic step. For that reason, Kan provides *nested transactions* [\[28,](#page-38-0) [29\]](#page-38-1). A nested transaction is constructed by making a *parent transaction* which does one of the following:

- It makes a synchronous method call to a method (possibly on some other object) that contains one or more transactions.
- It makes an asynchronous method call to a method that contains one or more transactions, and joins with the future before completing.

Although the parent transaction and each subtransaction has a (possibly trivial) guard, all of them must appear to the rest of the system to execute in one atomic step. Kan's nested transactions are very similar to those appearing in the literature on databases, and are related to those featured in Argus [\[25,](#page-38-3) [26\]](#page-38-4).

As an example, consider the transfer of funds from account X to account Y . We must ensure that money is not created (the withdrawal from X fails, but the deposit to Y succeeds) or lost (the withdrawal from X succeeds, but the deposit to Y fails). That is, the entire transfer must take place in one atomic step. Consider the code of Figure [3.](#page-5-0) It starts the deposit action asynchronously, does the withdrawal, then ensures that both actions have completed. If the withdraw action cannot be completed due to insufficient funds, then it throws an InsufficientFundsException, causing an abort of the entire transaction due to a user exception. Otherwise, both actions complete atomically, thereby effecting the desired transfer.

2.3.1 Deadlock

Nested transactions make deadlocks possible. For example, consider a transaction that first locks object X , then attempts to lock object Y . Meanwhile, another transaction has locked object Y and is now attempting to lock object X. This is a classic case of deadlock. In general, unless the user obeys some locking protocol, the system must be prepared to deal with deadlocks.

Guards introduce another scenario in which deadlock can occur. Suppose a transaction has obtained a lock on object X , then goes to sleep on an unsatisfied guard. If the guard cannot be satisfied until some other thread obtains the lock on X , then deadlock has occured. Hence, when executing nested transactions, we cannot wait forever for an unsatisfied guard to become satisfied. After a finite time, we must abort and roll back the transaction. Note that single level transactions can sleep on unsatisfied guards indefinitely, because they will not hold any locks while sleeping.

Our solution to the deadlock problem is to make them invisible to the user. The system will take corrective action, aborting and rolling back one transaction out of a set that is (or might be) involved in a deadlock. This will allow the remaining transactions to acquire the needed locks and make progress. More information on this topic is provided in Section [3.4.3.](#page-12-1)

2.4 Consistency Model

When choosing a consistency model, we must balance the needs of the application programmer for a clear, intuitive model with the needs of the system to apply performance-enhancing optimizations. In the case of shared read/write memory, weakly consistent systems enable optimizations while providing the equivalent of a strong memory model for certain common classes of programs. However, the situation is less clear with shared object models. Weakly consistent objects are poorly understood. Indeed weak consistency appears to be incompatible with objects that make method calls on each other up to arbitrary depths. For that reason, shared object systems are often linearizable [\[19\]](#page-38-5).

However, there is an intermediate ground. Java programmers are already used to programming in a multithreaded environment, marking critical sections of code with synchronized. We extend this programming model to Kan, and guarantee that transactions (or atomic actions) are linearizable with respect to each other. This gives the programmer the freedom to leave code that is known to be free from interference outside of transactions, thereby avoiding the cost of atomic actions. However, if code outside of a transaction executes concurrently with a transaction, we make no guarantees that the effects of the nonatomic code are made visible everywhere (or indeed, anywhere).

Nested transactions are exactly like their counterparts in databases. The entire nested transaction must appear to the rest of the system to take effect in one atomic step. We give a design that accomplishes this in Section [3.](#page-8-0) Note that our consistency model is equivalent to linearizability iff every method consists of exactly one transaction and there is no nesting.

2.5 The Kan Programming Language

Since we selected Java as the implementation language for Kan, we chose Java as the programming language as well. However, Java does not fully support our distributed object model. In fact, strictly speaking, Java does not support distributed programming at all. In conjunction with RMI, Java supports *remote* programming. However, there is no support for object directories, object replication and migration, etc. in RMI. For these reasons, we have enhanced the Java language both with the keywords described above, and with the following additional features.

In addition to the asynch and guard keywords, Kan uses the global keyword as a modifier for classes. It marks the class as needing special preprocessing by the Kan compiler to make it suitable for distribution. In recognition of the fact that programmers will want to use existing libraries of Java code, the Kan system

```
public class Barrier {
    private int N; // # of processes
    private int in = 0; // # entered barrier
    private int out = 0; // # left barrier
    public Barrier (int num) {
        N = num;
    }
                                                            public synchronized void join() {
                                                                 if (++in == N)notifyAll();
                                                                 else while (in \neq N) {
                                                                     try \{ wait(); \}catch (InterruptedException e) {}
                                                                 }
                                                                 if (++out == N)in = out = 0;
                                                             }
                                                         }
```
Figure 4: A Java barrier

also supports the use of Java classes that have not undergone such preprocessing. However, objects of such classes do not have global handles. They can only be accessed via some global object that contains references to them. Such references cannot be shared between global objects successfully, since the global objects may not be colocated. Hence, great care must be taken to ensure that each *local* object is referred to by at most one *global* object. The Kan system itself does not enforce this restriction.

Java applications are started at a method named main in a class identified by the user. This method must have the signature public static void main (String[] *args*). A distributed Kan application may need more information. It may need to know about the number of nodes on which it is executing, for example. Information about a distributed application is packed into a kan.comm.AppInfo object, which is passed as the first argument of main. That is, the main method has the signature public static void main (AppInfo *app*; String[] *args*) for Kan applications. The number of nodes can be determined, for example, by calling *app*:numNodes().

The new keyword is used to create objects in Java. In Kan, it can be used in the same manner as in Java. When a distributed object (that is, an object of a class declared global) is created, it is created on a node chosen in a round-robin fashion. The user can also select the node on which an object is initially created² using an alternate syntax. In an application running on N nodes, the nodes are identified by the integers zero through $N - 1$. To create a distributed object on node i, the programmer writes a statement of this form: $DistObj dObj = new(i) DistObj (args).$

Currently there is no support for static methods or variables in global Kan objects. Such support requires treating the class itself as an object, and turning references to static methods and variables into global object references. This will be implemented in a future version of Kan.

2.6 Example

As a final example of the model and language, consider a barrier over a fixed set of processes or threads. One way to implement a barrier in a shared data environment is to have each thread atomically increment a counter as it enters the barrier. The last thread to enter the barrier sees that the counter equals the total number of threads using the barrier, and signals all threads to exit. The barrier can be made reusable by detecting that all threads have exited the barrier and resetting the state of the barrier at that time. If done in Java, the results might look like the code in Figure [4.](#page-7-1)

However, this code is incorrect. It demonstrates a common Java programming error. Even though the join method is synchronized, interference can still occur between separate uses of this supposedly reusable

 2 The system may choose to move or replicate the object after its creation, however.

```
public class Barrier {
    private int N; // # of processes
    private int in = 0; // # entered barrier
    private int out = 0; // # left barrier
    public Barrier (int num) {
        N = num;
    }
                                                             public void join() {
                                                                 guard (out == 0)in++;
                                                                 guard (in == N) {
                                                                     if (++out == N)in = out = 0;
                                                                 }
                                                             }
                                                         }
```
Figure 5: A Kan barrier

barrier. On the first use of the barrier, the final thread to enter executes a notifyAll and exits the barrier. Suppose it does not lose its timeslice, does all the work of the next phase, and reenters the barrier. Now *in* is ^N + 1, so it waits. Eventually, the last thread from the first use of the barrier exits, and *in* and *out* are reset to zero. But there is a thread waiting in the barrier already, so after all other threads enter the barrier for the second time, *in* will equal $N - 1$, and no thread can exit the barrier.

Waiting and notifying are difficult to do correctly in Java, even within the same method. When corresponding waits and notifies are spread across methods, or even across classes, mistakes become very easy to make. In contrast, consider the Kan version of the barrier, shown in Figure [5.](#page-8-1) The structure of the barrier is clear, with one transaction for entering the barrier and another for exiting the barrier. The dataflow synchronization requirements are explicit, instead of being hidden in implicit wait/notify pairs. Kan's support of guards allows the programmer to avoid reasoning about all points in the program where notification should be inserted, reducing the number of errors made in such cases.

3 Kan System Architecture

In this section, we describe the design choices made when implementing the Kan system. The main concern was to correctly implement the model described in Section [2.](#page-3-0) The secondary concern was to implement the model efficiently, a topic we turn to in Section [4.](#page-12-0) The major components of the Kan system, and their relationship to one another, are shown in Figure [6.](#page-9-0) We will cover each of these components in the succeeding sections. All of these components have been implemented, except for the garbage collector, which is under construction (see [\[5\]](#page-37-6)), and the fault tolerance module, for which we have a paper design.

3.1 Communication

Kan objects are transmitted over the network using Java serialization. At the lowest layer, the network is accessed with Java sockets. These have the advantage of providing a simple, uniform interface across all Java platforms. Furthermore, socket programming has a long history, so the issues involved in programming them are well understood. Future revisions of Kan will implement network-specific communication layers. This will require native code for each network type, so the socket code will be retained as the default in case no applicable code is available. Active Messages [\[41\]](#page-39-5), in particular, appear promising as a way of reducing communication costs. Currently, Kan sets up socket connections between all pairs of nodes at startup. This approach is not scalable. Future work will manage sockets as resources, setting them up on demand, and limiting the total number of sockets open at any one time. This approach will also provide a greater degree of fault tolerance.

Figure 6: Kan System Organization

3.1.1 Physical and Logical Nodes

A Kan system is composed of a set of computers communicating over a network. We refer to each computer as a *physical node* of the Kan system. The class kan.comm.PhysicalNode contains the socket and object stream information needed for communication over the physical network.

Another view of a node is as a container of user objects, threads, and transactions. However, this is a different kind of entity, as user objects and threads can be moved among the physical nodes of a system. We call these containers *logical nodes*. Initially, there is exactly one logical node per physical node. Currently, the initial configuration remains stable throughout execution of a Kan application. However, we plan to implement a fault tolerance scheme that remaps logical nodes to different physical nodes due to failures. Also, the current system allows multiple Kan applications to run simultaneously, possibly resulting in logical nodes from different applications residing on the same physical node.

An object of class kan.comm.LogicalNode contains information about a single logical node. Each logical node has a globally unique identifier. In the current implementation, the ID is a 64-bit value. The upper 32 bits are the IP address of the physical node initiating the associated application. The lower 32 bits are uniquely assigned by the initiating node, based on a counter kept by each physical node. This scheme will have to be redesigned for other network types (including networks using 128-bit IPv6 addresses).

Each LogicalNode object either resides on the local physical node or on a remote physical node. If it is local, it has a reference to a kan.comm.LocalLogicalNode object, which contains references to the object and thread containers for that node. Otherwise, it has a reference to a kan.comm.RemoteLogicalNode object, which contains interface code for sending messages to such a node.

3.1.2 Messages

The various nodes of a Kan system use objects of class kan.comm.Message to send messages to one another. This class has fields holding the originating and destination nodes of a message, as well as an automatically generated sequence number. This number is used to match replies up with the messages to which they are replying. The two main subclasses of Message are kan.comm.SysMessage (system messages), for communication between physical nodes, and kan.comm.AppMessage (application messages), for communication between logical nodes.

Examples of messages that are sent between physical nodes are those regarding application startup and teardown, and fault tolerance traffic. Messages that are sent between logical nodes will be described in more detail below. They include messages for invoking method calls and returning values, creating objects, and object coherence traffic.

The fact that messages exist in a class hierarchy simplifies message handling. We use polymorphic dispatch to tell each message to handle itself, once the message object has been reconstituted. This approach lets us avoid constructing tables of message types inside the communication layer. However, this again trades off speed for convenience, as polymorphic dispatch incurs a runtime cost.

3.2 Distributed Objects

Global objects, when created, are assigned a globally unique ID, consisting of the ID of the creating logical node and a counter maintained by that node. Each global object has a controller, an object of class kan.obj.KanObject. This controller tracks replicas, and provides the interface for hiding object typing (see Section [4.4\)](#page-28-0) from the rest of the system. Object typing determines the consistency and locking protocols used to access the object. Each object and object replica has an associated local lock. These locks solve the preemptible, guarded readers/writers problem. That is, they provide both shared (read) and exclusive (write) locks, each in both preemptible and nonpreemptible mode, and also ensure that a lock is only held by a thread with a satisfied guard. To lock a replicated object, one must also lock all of the replicas. This is considered in more detail in Section [4.4,](#page-28-0) which describes object typing.

3.3 Distributed threads

Asynchronous method calls can cross physical node boundaries. Each such method call is assigned a globally unique ID. These IDs are constructed exactly like object IDs. In fact, they have a common superclass, kan.util.ID, which is also used to construct globally unique IDs for other Kan constructs (see Sections [3.3.2](#page-11-0) and [3.4\)](#page-11-1).

3.3.1 AsynchCall vs. KanThread

Java threads may carry information that is not easily moved between Java Virtual Machines. In particular, an implementation is allowed to give each thread a native stack, with native machine pointers to local data structures. Such pointers cannot be meaningfully transferred across a network. For this reason, Java threads cannot be serialized and deserialized successfully.

However, we need to do exactly that in order to support the fault tolerance scheme we plan to implement in Kan. When a node fails, the threads that were executing on it must be reconstituted elsewhere. Therefore, we encapsulate the work to be done by a thread in an kan.thrd.AsynchCall object. Each AsynchCall is run by associating a kan.thrd.KanThread (subclass of java.lang.Thread) with it. Although we cannot transfer KanThreads between nodes, we can transfer AsynchCalls, thereby giving us the desired functionality. Note also that the IDs described above are assigned to the AsynchCall objects, not the KanThread objects.

3.3.2 Future

A kan.thrd.Future holds the result of an asynchronous method call. Each is assigned a unique ID so that results can be returned across the network successfully. This ID is constructed like all other globally unique IDs considered so far.

A joining thread calls one of the family of join methods defined in class Future. There is one that returns object types, one for each of the primitive types, and one that returns nothing (i.e., it is of type void). Each of them acquires a lock on the Future object, then checks whether it is marked as completed. If not, then a wait() is executed to put the thread to sleep until the method call returns. If so, then the appropriate value is returned. However, if the called method terminated due to an exception, that exception is rethrown at this time, rather than returning a value.

When a method call terminates, the return value is shipped back to the calling node, if it is not local. There a lock is acquired on the appropriate Future object, the return value (or exceptional value) is stored in the Future object, and a notifyAll() is executed to wake up any sleeping threads. Note that a notifyAll is necessary, and not a notify, since the user may have passed the Future object around, resulting in multiple threads attempting to join.

3.4 Transactions

Guarded atomic sections of code are implemented with a transactional mechanism. This mechanism handles automatic abort and restart of transactions to avoid deadlock. Each transaction has a unique transaction ID, constructed just like all the other global IDs described above. In addition, nested transactions carry the ID of the top-level transaction. We define a total order on transaction IDs, which is used in the wound-wait algorithm to decide how to break deadlocks.

3.4.1 Blocking

Some transactions might block midway, due to waiting for a method call to complete, for example. Such transactions might be aborted and rolled back, so undo information must be kept. Other transactions will never block, so we optimize by not keeping the undo information.

Currently, the undo information consists of a copy of the original object. Transactions use this copy to restore the original state of the object in case of an abort. Aborts are represented as exceptions, subclasses of kan.trans.TransactionAbortException. Transaction managers install appropriate try-catch blocks to catch aborts and restart the affected transaction.

3.4.2 Nested Transactions

Since transactions are limited to accessing the state of a single object, multiple object atomic actions are accomplished with nested transactions [\[28,](#page-38-0) [29\]](#page-38-1). These occur when a transaction contains one or more method calls that are either synchronous or joined within the scope of the transaction.

Transactions can nest to arbitrarily deep levels. The initiating transaction is referred to as the *root* transaction. When nesting occurs, there is a *top-level* transaction that starts the nesting; the others are called *child* transactions. The terms *ancestor* and *descendant* are defined in the obvious way.

We want the full set of ACID properties to apply to an entire nested transaction hierarchy as a whole. Hence, when a subtransaction completes, its effects cannot be made visible outside of the hierarchy. No effects can be seen until the entire hierarchy is prepared to commit. For this reason, local copies of objects can be tagged as being visible only to subtransactions of some transaction ID. As commits occur, the tags are revised upward in the nested transaction tree. When the top-level transaction commits, the copy visible to that transaction becomes the new, globally visible copy of the object.

Since nested transactions may span multiple nodes, we need a mechanism for ensuring atomic actions across nodes. We choose 2-phase commit for that purpose. When the top-level transaction is ready to commit, it tells all of its subtransactions to prepare to commit. At that time, they all change their preemptible locks to nonpreemptible locks. If any subtransaction is unable to make the lock conversion (due to preemption), it signals an abort. Otherwise, the subtransactions signal that they are ready to commit, and the top-level transaction sends out the final commit message.

3.4.3 Deadlock

The Kan system uses a conservative method for breaking deadlocks, similar to the scheme used by Argus [\[25,](#page-38-3) [26\]](#page-38-4). Nonnested transactions acquire only one lock, so they are not involved in the deadlock breaking system. We use the wound-wait algorithm described by Moss [\[29\]](#page-38-1). Accordingly, each transaction is given a timestamp at its creation, which is encoded into its transaction ID. These timestamps do not necessarily correspond to real time; that is, a transaction created later in real time may have an "older" timestamp than some other transaction. Nevertheless, they have the monotonically increasing property that ensures the absence of deadlock.

When a nested transaction T attempts to acquire a lock, it first checks whether some other nested transaction holds the lock. If a younger transaction S (one with a higher timestamp) holds the lock, then T *wounds* S, causing it to abort, roll back, and release the lock. If an older transaction holds the lock, then T *waits*. Waiting transactions are sorted by timestamp so that the oldest waiting transaction is always given the next chance to acquire the $lock³$.

It is not necessary to wound a younger transaction immediately, since there may be no deadlock in fact. The Kan system sets a timer on detecting a situation calling for the wound action. If the transaction holding the lock has not released it when the timer expires, it is wounded then. The value of the timer is a tuneable parameter of the system, since a reasonable value will be affected by such factors as network latency and clock speed of the computers involved.

4 Performance of Kan

In this section, we describe the Kan optimizations in more detail, and measure their performance impacts. We use microbenchmarks to assess performance. The measurements presented in this section were taken on a set of 350 MHz Pentium II machines. Each runs the Solaris operating system, either version 5.6 or 5.7. Each machine has 128 megabytes of RAM. Our Java platform is the JDK 1.2.2 reference implementation (also known as the Java SDK 2, version 1.2.2). All Java source files were compiled with optimization enabled. Note, however, that the Java compiler produces identical bytecode with optimization on and off for most of the microbenchmarks in Section [4.1,](#page-13-0) since they were written in a manner that is intended to defeat optimizations. Finally, all measurements were made with "green threads", a user-level thread system, rather than the heavier-weight native threads. Native threads are managed with operating system support, resulting in degraded performance on uniprocessor machines such as those we used in these tests. Each set of measurements is made twice, once with the Just-In-Time (JIT) compiler enabled, and once with it disabled. All measurements were repeated at least 10 times, and more if needed to obtain a reasonable range of values at a 95% confidence level. Each individual measurement is made by repeating the action to be measured tens of thousands to tens of millions of times, as appropriate for the time scale of the action, and dividing the total time by the number of loops. We assume that the looping time is negligible when measuring Kan constructs.

 3 However, the oldest transaction is not guaranteed to get the lock, since its guard may not be satisfied.

Clock function	HТ	No JIT
System.currentTimeMillis	6.093 ± 0.025	6.169 ± 0.062
Timer.currentTimeNanos		5.165 ± 0.005 5.071 ± 0.016
gettimeofday		5.236 ± 0.004
clock_gettime	4.432 ± 0.015	

Table 1: Clock reading time, in microseconds

The local network is a 10 Mbps (or "slow") Ethernet. The round-trip latency on the network is $350.859 \pm$ 2:981 microseconds between machines on the same subnet. The latency between two machines that are as far apart as possible, in the network sense, in our local network is 1064.086 ± 10.646 microseconds under conditions of light use.

Although the times presented in this section appear very high, especially compared to other Java-based systems such as Jaguar [\[43\]](#page-39-6), and JavaParty [\[35\]](#page-39-7), bear in mind the following:

- Systems such as Jaguar and JaVIA concentrate on improving the raw performance of Java's communication substrate; namely serialization and the transfer of serialized objects over Java sockets. Kan, on the other hand, is a user of the communication substrate, not a provider thereof. Jaguar or JavaParty, for example, could be used with Kan to improve Kan's performance.
- Such systems typically report performance measurements taken on faster networks. Jaguar, for example, uses 1.2 Gbps Myrinet, as opposed to Kan's 10 Mbps Ethernet.
- The point of Kan is not its raw speed, but that it provides distributed (i.e., possibly replicated or migrating) objects and transaction support on those objects at a cost comparable to that of native Java RMI. RMI, on the other hand, offers only *remote* objects; that is, the objects reside at fixed locations. Supporting distribution requires additional machinery on top of RMI.

4.1 Basic Java Costs

In this section, we give the basic costs of using the Java system described above. Several fundamental costs are described and measured, namely those of reading the clock, making method calls, creating and starting threads, synchronization, and the Serialization of objects.

4.1.1 Reading the Clock

First we give the overhead of collecting timing information, in Table [1,](#page-13-1) so that we know how other measurements are affected by reading the time. First we measure System:currentTimeMillis(), which is the standard way of getting the current time in Java. This has millisecond resolution, and is based on a call to the Solaris function gettimeofday.

Millisecond resolution is too coarse for our purposes, so we implemented our own native code that calls the Solaris function clock_gettime, which is available in the POSIX4 library on Solaris 2.6 and the RT (realtime) library on Solaris 2.7. This function has nanosecond resolution (although only microsecond accuracy on the test machines). A number of clocks are potentially available. We use CLOCK_REALTIME, which is the only clock available on our test systems, returning wall clock time. Some systems also support CLOCK_VIRTUAL, which reports only actual CPU usage, taking context switches into account. Our Java interface is through Timer:currentTimeNanos().

Finally, we measured the cost of calling the two C functions, so we can see how much overhead is inherent in the Java Native Interface (JNI), which allows Java programs to call "native" (binary) code. The

Method type	JIT	No JIT
No args, returns void	114.264 ± 0.611	429.611 ± 9.166
1 int arg, returns void	120.567 ± 1.327	501.329 ± 4.064
32 int args, returns void	407.189 ± 3.022	2390.348 ± 5.783
1 ref arg, returns void	135.146 ± 1.739	662 086 \pm 0.969
1 ref arg, returns int	178.004 ± 1.307	720.158 ± 2.013
1 ref arg, returns int, final	178.708 ± 1.846	719.954 ± 1.212
1 ref arg, returns int, static	111.492 ± 1.220	609.744 ± 0.857

Table 2: Method calling time, in nanoseconds

Activity	ШT	No JIT
Create 1	4419.167 ± 29.810	283.328 ± 0.718
Create 100	86.539 ± 0.458	72.788 ± 0.392
Start 1	1850.654 ± 48.114	544.878 ± 1.543
Start 100	521.792 ± 2.529	440.341 ± 1.082

Table 3: Thread costs, in microseconds

Java settings make no difference for these results. On our platform, the JNI overhead is approximately 650 to 950 nanoseconds per call to the time functions.

4.1.2 Method Call

Method calls are one of the fundamental activities performed by Java programs. The cost of making a method call is greatly affected by the number of parameters, since each must be pushed onto the stack. Whether there is a return value or not also affects the time. Finally, calls to static methods are faster than calls to instance methods. This is partly due to the fact that instance methods have a hidden parameter, *this*, and partly due to the fact that static method calls are resolved at compile time. The results of our experiments are shown in Table [2,](#page-14-0) in nanoseconds. A "ref arg" is a reference argument, that is, a parameter of object (or array) type. Note that the final keyword did not impart any significant difference in method calling time.

4.1.3 Threads

Thread creation and startup costs turn out to be a major component of application overhead. Creating a thread involves allocating a stack, and setting up internal parameters. Starting a thread is a slow process, typically involving complicated manipulations of the scheduler state. Table [3](#page-14-1) shows the results, in microseconds, of creating a single thread, creating a batch of 100 threads, starting a single thread, and starting 100 threads in a row. Notice that working with larger numbers of threads improves the average time, most notably for thread creation.

4.1.4 Synchronization

The synchronized keyword marks a method or block of code as needing to acquire a lock on some object before continuing. This is the only synchronization primitive offered by the Java language. The performance of synchronization has been a major concern for the developers of JVMs, and has been the subject of various attempts at optimization (e.g., [\[2\]](#page-37-7)) or avoidance (e.g., [\[7\]](#page-37-8)). In Table [4,](#page-15-0) we give the cost of entering and exiting a synchronized block with no actions inside the block, in nanoseconds. We measure the cost with

Object	Class	Per-	Single
type	overhead п	object	object
int			10
int[100]	17	10	427
Integer	71	10	81
Node	261	144	405
Tree	261	2026	2287
Complex	132	18	150

Table 5: Serialized size, in bytes

three levels of contention: none (only one thread is running the program), ten threads are vying for the lock, and 100 threads are vying for the lock.

4.1.5 Serialization

Java provides a way of converting objects into portable byte streams, and then reconstituting objects from those streams. The conversion of an object to a byte stream is called *serialization*; reconstituting an object is called *deserialization*. We use serialization to send message objects between nodes. The serialization features of Java is not known for its good performance. In fact, it is one of the major bottlenecks in the performance of Kan. In this section, we measure its performance.

We use a variety of objects to measure the performance of serialization:

- A primitive type, int, which is a 32-bit quantity.
- An array of 100 ints.
- A "wrapped" int. This is an object with a single field, of int type. It is used to store integers in contexts where an object is required. Its type is java.lang.Integer.
- A Node object, which is a component in a tree. It has 34 fields. Two of the fields are references to other Node objects; they are named *left* and *right*. The other 32 fields all have type int. They are named *i1*,..., *i32*.
- A tree, which is a balanced binary tree of 15 Node objects.
- A "complex" structure. This is an instance of class ComplexC, which has one field named *val* of type int, and is a subclass of class ComplexB. Class ComplexB has one field named *ber* of type int, and is a subclass of class ComplexA. Finally, class ComplexA has one field named *num* of type int.

In Table [5](#page-15-1) we show the number of bytes that are produced when these objects are serialized. The first column shows the number of bytes that are used to represent the class or type of the object. The second column shows the number of bytes that are used to represent a single instance of the class or type. The third

Object	With class information		Without class information	
type	JIT	No JIT	JIT.	No JIT
int	2.189 ± 0.003	2.100 ± 0.016	1.807 ± 0.004	2.120 ± 0.012
int[100]	149.359 ± 1.467	304.500 ± 0.698	102.397 ± 2.754	299.623 ± 1.379
Integer	71.362 ± 0.705	105.571 ± 0.408	59.681 ± 0.997	100.979 ± 0.234
Node	182.580 ± 5.959	262.198 ± 0.691	151.677 ± 1.843	244.046 ± 0.373
Tree	2010.762 ± 30.021	3339.244 ± 13.913	1917.007 ± 29.781	3287.843 ± 18.774
Complex	72.755 ± 0.637	139.181 ± 0.294	71.795 ± 0.691	136.916 ± 0.156

Table 6: Serialization times, in microseconds

Object	With class information		Without class information	
type	JIT	No JIT	JIT	No JIT
int	5.506 ± 0.027	13.555 ± 0.049	3.588 ± 0.000	13.417 ± 0.028
int[100]	125.999 ± 0.287	281.582 ± 0.778	67.146 ± 0.823	263.665 ± 0.406
Integer	63.991 ± 0.744	104.493 ± 0.169	45.791 ± 0.379	98.528 ± 0.181
Node	158.346 ± 2.506	268.440 ± 1.214	139.453 ± 0.938	249.788 ± 0.300
Tree	$\overline{2005.962} \pm 30.181$	$\overline{3638}$ 721 ± 11.239	1968.107 ± 27.598	3614.023 ± 14.199
Complex	82.748 ± 2.003	168.452 ± 1.336	65.097 ± 0.575	147.952 ± 0.113

Table 7: Deserialization times, in microseconds

column, which is simply the sum of the first two columns, shows how many bytes are produced if a single object of that class or type is serialized.

There are two anomalies in this table that should be noted. First, for the integer array, the third column is not the sum of the first two. In this case, 17 bytes are written to represent the $int[100]$ type, 10 bytes are written per array, and the array elements have the cost of single ints; i.e., 4 bytes each. Hence, a single array is serialized to $17 + 10 + 4 \times 100 = 427$ bytes. Second, the tree consists of 15 Node objects, each of which takes 144 bytes. However, the per-object size of a tree, 2026, is not $15 \times 144 = 2160$. The reason is that the leaf nodes of the tree have null left and right pointers, and null has a more compact representation than a Node reference.

In Table [6,](#page-16-0) we show how long it takes to serialize these objects, in microseconds. The first two columns show the time it takes when the class information is also written to the serialization stream. The second two columns show the time taken when the class information has already been written to the stream. The difference is the time it takes to write that class information. We serialize to an array of bytes in memory, to avoid filesystem access costs.

In Table [7,](#page-16-1) we show how long it takes to deserialize these objects, or reconstitute them from an object stream, in microseconds. The first two columns show the time it takes when the class information has not yet been read from the serialization stream. The second two columns show the time taken when the class information has already been read from the stream. The difference is the time it takes to read the class information, and find the associated class. We reference each object type before the timing loop, so that class loading time is excluded from the results shown in the table. We also deserialize from an array of bytes in memory, to avoid filesystem access costs.

4.2 Kan Thread Costs

The asynchronous method calling capabilities of Kan provide a simple, powerful mechanism for introducing concurrency into Kan programs. In this section, we investigate the performance of the Kan asynchronous

Table 8: Kan async method calling time, in microseconds

method calling mechanism, and study the effects of some optimizations.

4.2.1 Kan and Java RMI

The following steps are one obvious way of supporting the semantics of a Kan asynchronous method call:

- 1. Create a Future object to hold the method results, and assign it a unique ID.
- 2. Determine whether a local copy of the called object exists.
- 3. If no local copy exists, then:
	- (a) Marshal the arguments, method name, object ID, and Future ID.
	- (b) Send an invocation request to some copy of the object.
	- (c) Unmarshal the arguments and other information on the remote node.
- 4. Create a thread to make the method call.
- 5. Using reflection, make the method call.
- 6. On completion of the call, if the call was remote:
	- (a) Marshal the result, whether normal or exceptional.
	- (b) Send the result and the Future ID back to the originating node.
- 7. Store the result in the Future object and allow any pending join actions to complete.

We implemented this scheme in Kan. The results are shown in Table [8](#page-17-0) for a variety of method signatures. Each signature is described as the parameter types, followed by a comma and the return type.

For comparison purposes, we also measured the costs of making a remote method call with Java's Remote Method Invocation (RMI) package, using the same method signatures. The results are shown in Table [9.](#page-18-0) These numbers are significantly lower than those for Kan, in Table [8.](#page-17-0) Part of that is due to the fact that Kan does more than RMI. RMI gives the ability to access *remote* objects, that is, those at known network locations; however, it gives no support for *distributed* objects, that is, those that might migrate or be replicated. Such support must be built on top of RMI.

We tested the performance of Java RMI with the same structures that Kan uses to support asynchronous method calls on distributed objects. The result is shown in the last line of Table [9.](#page-18-0) Note that it took significantly longer to make this method call than with the other method signatures. In fact, Kan has better

Method type	JIT	No JIT
Void, void	1315.047 ± 11.967	1653.024 ± 23.128
1 int, void	1376.068 ± 39.148	1704.321 ± 34.385
32 ints, void	2078.981 ± 7.157	2964.234 ± 5.952
$int[32]$, void	1822.955 ± 8.861	2380.704 ± 6.786
$\overline{1}$ Node, void	2116.841 ± 7.291	3258.233 ± 23.282
1 Tree, void	4070.608 ± 7.000	6519.519 ± 69.966
1 Node, int	2149.841 ± 12.548	3330.587 ± 51.431
1 Tree, int	4127.767 ± 29.583	6539.649 ± 70.854
Kan style args	4694.192 ± 16.485	8745.290 ± 87.538

Table 9: Java RMI times, in microseconds

Kan action	JIT	No JIT	
KanSystem.invokeMethod	27.200 ± 0.126	36.004 ± 0.079	
ThreadScheduler.createThread	29.776 ± 0.078	45.094 ± 0.151	
Serialize & send ExecMsg	2204.444 ± 4.380	3700.190 ± 8.809	
ExecMsg.handle	29.076 ± 0.121	36.848 ± 0.407	
ThreadScheduler.makeLocalCall	41.172 ± 0.484	50.529 ± 0.584	
AsynchCall.execute	8.683 ± 0.026	9.892 ± 0.139	
ThreadScheduler.done	6.435 ± 0.027	4.543 ± 2.773	
Serialize & send DoneMsg	899.991 ± 5.321	1324.733 ± 16.784	
DoneMsg.handle	29.501 ± 0.132	34.857 ± 0.085	
ThreadScheduler.localDone	22.683 ± 0.100	17.737 ± 1.945	
Joining overhead	69.753 \pm 0.342	67.717 ± 0.205	
Total	3418.940 ± 6.989	5409.849 ± 22.112	

Table 10: Kan remote method calling time breakdown, in microseconds

performance on a null method than RMI in this case. This means that RMI not only lacks some tools for distributing objects, but that such tools can be implemented on top of Java sockets more cheaply than they can be on top of RMI. This further limits the effectiveness of RMI for providing distributed solutions.

To see where the time is spent, we broke a remote method call (on a method with no parameters) down into steps. Table [10](#page-18-1) shows the names of the methods inside of Kan through which execution flows during a remote method call invocation. Note that the total is about 1 millisecond more than the times shown in Table [8.](#page-17-0) This is due to the necessity of passing timing information through the system. In particular, the message sending costs are inflated in Table [10,](#page-18-1) since an array of 8 longs is added to each message. An analysis of these figures shows that several hundred microseconds is being spent on the creation and starting of a new thread for each asynchronous method call. If we could remove that cost completely, nearly half of the remaining time (about 138 microseconds) would be paid in reflection and context switch costs. If we were able to eliminate those costs, we would still be 3 orders of magnitude worse than the native Java method calling costs reflected in Table [2.](#page-14-0) To deal with these costs, we implemented three optimizations, which we describe and measure in the remainder of this section.

4.2.2 Adaptive Thread Pool

Thread creation and startup costs can be largely eliminated with a simple structure. We maintain a thread pool, to which unused threads are returned while idle. If there is an available thread in the pool, we avoid the cost of Java thread creation, and we pay the startup cost only once per thread. However, there is a cost

Table 11: Thread Pool Behavior

associated with maintaining such a thread pool. Each thread has a stack; therefore, inactive threads in the pool are holding onto memory resources. Therefore, we have to balance our desire to have a large pool (to severely curtail or eliminate the possibility that a thread will be created) with our need to have enough memory for the user application to run.

We therefore implemented an *adaptive* thread pool, as originally described in [\[42\]](#page-39-8). The pool tries to maintain a size that matches the application's current needs. It monitors the number of idle threads in the pool across a fixed number of pool operations, and then *steps* the pool size up or down if needed. Between steps, if a thread is needed and the pool is empty, then a thread is created. If a method call completes and the pool is not full, the thread is added to the pool. If the pool is full, the thread is discarded. At each step, if threads were created during the previous interval, then we step up the pool size. If the pool was never empty during the previous interval, then we step down the pool size, as long as it does not fall below a fixed minimum. The step frequency, step size, and minimum pool size are all tunable parameters of the system.

Table [11](#page-19-0) shows the number of active threads, idle threads in the pool, and the pool capacity for a run of the system in which the program forks 200 threads, then immediately joins all of them. The minimum pool size is 50 threads; the interval is 40 pool actions, and the step size is 20% of the original pool size. Note that the application made 180 method calls before beginning to join any, and then made the remaining 20 calls after system activity had tailed off somewhat. The pool capacity tracked the speedy rise in demand, and tracked somewhat less closely the fall-off in demand.

We measured the performance of our simple method calling microbenchmark with the thread pool active. As shown in Table [12,](#page-20-0) the times are lower for both local and remote method calls (as compared to Table [8.](#page-17-0) To discover where the time savings was most evident, we also reran our time breakdown experiment. The results, as shown in Table [13,](#page-20-1) show that the cost of setting up a handling thread for a DoneMsg on the receiving side are significantly reduced, and the ThreadScheduler.makeLocalCall method represents the remainder of the savings.

Thread pools have been implemented in many systems, for the good reason that they can always be implemented more cheaply than the cost of starting a new thread. In some cases, the threading system itself does pooling underneath. Even so, a thread pool like Kan's adds minimal overhead, so the Kan-level pool

Method type	Local		Remote	
	JIT	No JIT	JIT	No JIT
Void, void	157.572 ± 0.387	207.784 ± 0.741	$2614.537 \pm$ 8.001	4218.637 ± 9.228
1 int, void	159.844 ± 0.681	210.136 ± 0.863	3381.118 ± 18.204	$\overline{5637.269} \pm 10.367$
32 ints, void	$\overline{183.463} \pm 3.365$	231.509 ± 1.010	6441.988 ± 27.833	11262.247 ± 87.319
$int[32]$, void	161.433 ± 0.216	210.253 ± 0.588	3260.032 ± 68.430	5263.548 ± 9.450
1 Node, void	161.296 ± 0.686	208.641 ± 0.856	3602.406 ± 101.405	6140.749 \pm 8.553
1 Tree, void	160.737 ± 0.326	211.577 ± 1.020	5329.746 ± 32.701	9382.398 ± 50.755
1 Node, int	164.719 ± 0.272	214.404 ± 0.756	$4722.381 \pm$ 9.435	8393.015 ± 20.906
1 Tree, int	164.620 ± 0.879	216.159 ± 0.648	$6512.642 \pm$ 34.961	11510.338 ± 11.233

Table 12: Thread pool performance, in microseconds

Kan action	JIT	No JIT
KanSystem.invokeMethod	27.372 ± 0.151	36.103 ± 0.100
ThreadScheduler.createThread	34.341 ± 0.355	46.077 ± 0.256
Serialize & send ExecMsg	2460.399 ± 14.946	4039.675 ± 33.255
ExecMsg.handle	32.770 ± 0.446	36.662 ± 0.145
ThreadScheduler.makeLocalCall	27.516 ± 1.189	35.956 ± 0.091
AsynchCall.execute	8.964 ± 0.212	9.544 ± 0.029
ThreadScheduler.done	6.481 ± 0.086	6.349 ± 0.011
Serialize & send DoneMsg	509.286 ± 18.856	826.961 ± 38.457
DoneMsg.handle	31.335 ± 0.217	34.975 ± 0.170
ThreadScheduler.localDone	21.625 ± 0.058	25.123 ± 0.224
Joining overhead	69.001 ± 0.325	69.727 ± 0.369
Total	3297.462 ± 13.774	5233.583 ± 26.137

Table 13: Kan remote method calling time breakdown, in microseconds

Figure 7: Thread Inlining

does little harm in such a case. In our case, the JDK 1.1 version of the thread pool showed more dramatic effects than the JDK 1.2 version, apparently due to reduced thread startup costs in 1.2. However, even with the reduced benefits, the thread pool is still able to reduce the cost of making asynchronous method calls in many cases and never increases that cost by a significant amount. Hence, the thread pool is always active in Kan.

4.2.3 Thread Inlining

The idea behind thread inlining is to avoid context switch costs. For local method calls, even if the user has asked for an asynchronous method call, if we know that the called method is short and will not block, it may be more efficient to execute it as a synchronous method call. That is, we inline execution of the child into the parent thread. On the other hand, if the parent method takes few steps between forking the asynchronous method call and joining with it, it may be more efficient to execute those few steps first, then make a synchronous call.

These two forms of thread inlining are represented graphically in Figure [7.](#page-21-0) In Figure [7\(](#page-21-0)a), we show a normal method call. When the asynchronous call is made, a second thread executes the called method while the parent thread continues with its activities, then eventually joins with the child thread. In Figure [7\(](#page-21-0)b), the called method is nonblocking. Hence, the original thread makes the method call immediately. Upon returning, it continues with its activities. The join then becomes a no-op, since the child method already finished executing. In Figure $7(c)$, the calling method is nonblocking between the call and the join. Hence, execution of the child method is postponed; the call is a no-op. When the join is reached, the parent then executes the child method synchronously.

As shown in [\[42\]](#page-39-8), implementing thread inlining introduces some overhead into the system, due to the necessary bookkeeping. In fact, if the parent makes only 1 or 2 method calls, the costs of inlining outweigh the savings. However, if the parent thread makes many method calls, then the savings can be substantial. We show the effects of making both 50 inlined child calls and 100 inlined child calls in Figure [8.](#page-22-0) For each, we made two kinds of calls. The 2-level calls are a single parent thread invoking multiple nonblocking children in parallel. The serial calls consist of a sequence of threads, each of which invokes the next.

As with the thread pool, we found that the benefits of thread inlining were reduced after switching to JDK 1.2. Indeed, uncontrolled inlining could potentially remove all concurrency in an application, resulting in a serial execution. For these reasons, it is not always appropriate to invoke the thread inlining code. Future work on Kan will include compile-time analysis to identify candidates for thread inlining, and to push some

Figure 8: Thread Inlining Performance

of the cost of inlining from run-time to compile-time.

4.2.4 Pointer Swizzling

The idea behind pointer swizzling [\[45\]](#page-39-9) is that a nonlocal object must be accessed via a global pointer, but that a local object can be accessed via a direct local pointer. Even local accesses via a global pointer are often expensive enough to make direct access desirable. Whenever an object becomes local (via replication or migration), local copies of its global identifier are changed, or *swizzled*, into direct pointers. Whenever an object ceases to be local, local direct pointers are changed into global identifiers. Pointer swizzling has been used in many database systems, to convert disk identifiers into memory addresses, and has also been used in a few programming languages, such as E [\[44\]](#page-39-10).

In Kan, we use pointer swizzling to avoid using reflection on local synchronous method calls. Instead, we directly call the method. To make a direct method call, not only must the object be local and the call synchronous (to avoid blocking the parent thread), but the call cannot be part of a nested transaction. Because nested transactions may be aborted and rolled back, Kan takes special actions during such transactions to enable it to restore the states of modified objects (see Section [3.4\)](#page-11-1). A direct method call bypasses those special actions.

Pointer swizzling eliminates almost all the cost of making a local Kan method call, leaving about 5.6 microseconds of overhead on top of the Java method call, as compared to the times shown in Table [2.](#page-14-0) The performance figures are shown in Table [14.](#page-23-0) Note that the JIT tends to cause slightly degraded performance, as is the case with several other microbenchmarks in this section. When objects are colocated, this optimization provides dramatic improvements in performance. To maximize the impact of this optimization, future work on Kan includes the development of compiler analyses to determine a call graph on the runtime objects, allowing the system to intelligently colocate objects so as to maximize local accesses.

Method type	JIT	No JIT
Void, void	5863.988 ± 8.926	5493.310 ± 5.781
1 int, void	5782.294 ± 107.449	5722.300 ± 46.449
32 ints, void	6003.146 ± 115.627	6354.307 ± 41.959
$int[32]$, void	5854.223 ± 50.400	5663.918 ± 24.147
$\overline{1}$ Node, void	5915.389 ± 24.561	5775.324 ± 11.757
1 Tree, void	5877.456 ± 49.694	5787.981 ± 13.828
1 Node, int	6024.161 ± 21.243	5805.999 ± 8.911
1 Tree, int	6138.235 ± 19.349	5864.142 ± 10.906

Table 14: Pointer Swizzling Performance, in nanoseconds

4.2.5 Final Comparison

In this section, we show the effects of all of our optimizations on method calling. In Figure [9,](#page-24-0) we show the relative costs of making method calls to methods without parameters or return values, using the systems and optimizations described above. These are the figures garnered while using the JIT, as listed in the tables earlier in this section. As illustrated in this figure, the optimizations we applied led to local method calls paying an additional cost of less than 6 microseconds over Java method calls. This is a constant amount of overhead. Methods that have parameters, return values, and nontrivial bodies will have execution times in the tens of microseconds or more, making the difference between a Java call and an optimized Kan call of little consequence.

Remote method calls in Kan are only slightly worse than their RMI counterparts, but provide more functionality. Indeed, when the same objects are transmitted with RMI, RMI takes longer than Kan to make the same method call. This suggests that RMI is not the best solution to distributed problems when replicated or migrating objects are desirable features.

4.3 Transaction Costs

Transactions provide a powerful mechanism for ensuring the atomicity of actions that begin in a known state. However, that power comes at a price. Simple local transactions can be quite cheap, especially if contention for the object is low. However, deeply nested transactions spanning multiple nodes can be quite expensive. The cost of a transaction is affected by the following factors:

- Locality: local transactions are significantly cheaper than transactions that span nodes.
- Number of objects: each object touched by a transaction must be locked.
- Depth: each level of a nested transaction must coordinate with the levels above it to provide linearizability of the whole. Increasing depth brings increasing costs.
- Type of transaction: this is described in the next paragraph below.
- Access type: reading transactions acquire shared locks, while writing transactions acquire exclusive locks.
- Rollbacks: aborted transactions and rollbacks represent wasted work that consume resources without providing any benefit.

To support rollbacks, we make a copy of each object touched before the transaction commences, as described in Section [3.4.](#page-11-1) One optimization we implemented to reduce costs is to differentiate between three

Figure 9: Method calling comparison, in nanoseconds

Access	Blocking		Nonblocking	
type	ЛT	No JIT		No JIT
	Read $\ 2.248 \pm 0.041$	3.860 ± 0.046	2.254 ± 0.032	3.862 ± 0.120
Write	1.922 ± 0.041	3.229 ± 0.069	1.911 ± 0.046	3.252 ± 0.049

Table 15: Transaction type test, in microseconds

kinds of transactions: nonblocking, blocking, and nested (in order of cost). A nonblocking transaction is one which does no joins and throws no exceptions, so we can be sure that it will complete normally. We optimize in that case by skipping the object copy, since it will never be used. A blocking transaction is a single-level transaction that joins with some future or might throw an uncaught exception. In that case, we make a copy. Both nonblocking and blocking transactions are single-object transactions, so they can never be involved in a deadlock. Therefore, we we optimize again by excluding such transactions from the wound-wait algorithm (described in Section [3.4.3\)](#page-12-1).

We performed several experiments, to see the effects of varying the cost factors listed above. The first experiment was to determine the effectiveness of our copying optimization. For this test, we executed calls on a method consisting of a single transaction. We tried all four combinations of read/write and blocking/nonblocking transactions, and measured the total time (including the method call). The results are shown in Table [15.](#page-24-1) This shows the effect of skipping the copy on a very small object. In this instance, the difference is not statistically significant. However, the gap increases with object size, as the cost of copying increases. We varied the object size to see the effects on writing transactions, as shown in Figure [10.](#page-25-0) Since the nonblocking transaction is performing the same actions every time, its cost does not change. However, the cost of making an object copy rises with object size. We cannot measure the in-memory size of a Java object directly; the object sizes in the figure represent the serialized size of an object, which, in general, is larger than the actual memory footprint of the object.

Figure 10: Object copy optimization

Figure 11: Transaction locality test

Figure 12: Transaction object number test, 2 nodes

The next experiment was to determine the effects of nonlocal objects on transaction performance. For this test, we spread the objects to be accessed by a nested transaction across varying numbers of nodes. (Note that a nested transaction is blocking by definition, since the wound-wait algorithm may abort it.) Each is a 2-level nested transaction that operates on one object per node. The results are shown in Figure [11.](#page-25-1) The cost of a non-local transaction rises in nearly a straight line for all four variations. This is a result of the configuration of our LAN, where access to any remote node costs about as much as access to any other. The cost reflected here is that of accessing remote objects at all; the precise location of those remote objects is of little consequence. The results would be very different on a nonuniform network.

Next we varied the number of objects accessed by each nested transaction. We ran a 2-level nested transaction, where the top-level transaction spawned $N - 1$ children, each accessing a different object, where N is 2, 4, 8, and 16. The results are shown in Figures [12](#page-26-0) and [13.](#page-27-0) For two nodes, the cost of increasing the number of objects is once again nearly a straight line. This is due to the necessity of acquiring a lock on each such object. However, for 16 nodes the picture has changed. Now, larger numbers of objects apparently result in reduced cost in some cases. This effect is the result of an optimization in Kan. When a nested transaction spans multiple nodes, the 2-phase commit messages are batched together by node. Thus, expensive network communication rises most significantly with the number of nodes involved in a transaction, and with the number of objects only to a lesser extent.

Next we assessed the impact of deeply nested transactions. Such transactions hold many object locks simultaneously. They also increase the overhead for managing object consistency within the nested transaction itself. We varied both the depth and the number of nodes across which the accessed objects were spread. The results are shown in Figure [14.](#page-27-1) After some rapid growth in latency going from 2 to 4 nodes, the growth curve slackens off. Even with transactions nested to 8 levels deep, Kan scales nicely to 16 nodes with the JIT in effect, the limit to the number of homogeneous machines we have on our LAN.

Finally, we assessed the impact of rollbacks on transaction throughput. For this test, we wrote a transaction that always fails with a user exception, giving the user the opportunity to handle the abort. We cause

Figure 13: Transaction object number test, 16 nodes

Figure 14: Transaction depth test

Figure 15: Transaction abort test

the abort inside of a 2-level nested transaction, which has already accessed N objects, N equal to 1, 2, 4, 8, or 16. This test measures the time to acquire a lock on the object, signal the abort, restore the original state of the object, and release the lock. In fact, restoring the original state is an extremely cheap operation, since we copied the entire object before beginning. Therefore, the cost of an aborted transaction is always cheaper than that of a committed transaction on the same object. For that reason, the results of this experiment are very similar to those obtained in the locality test of Figure [11.](#page-25-1) The results of our abort test are given in Figure [15.](#page-28-1) Once again, we do not see an upturn in the curve up to 16 nodes, indicating that Kan is well suited for LANs of such size.

4.4 Object Types

Reducing distributed object management costs rests largely on this principle: maximize the number of accesses that are local. An optimal scheme would place a copy where the object is about to be read, and would reduce the number of copies to one before every write. In reality, optimal schemes are hard to approach, because different objects are accessed in different ways.

The Munin [\[12\]](#page-37-9) shared memory system managed shared variables depending on user access patterns, thereby yielding substantial gains in efficiency. In this section, we describe how Kan manages shared objects in a similar fashion to raise the percentage of method calls that are local. Currently, Kan implements only two object typing schemes, general and migratory. In the future, we plan to investigate other object types that can be implemented in Kan.

4.4.1 Migratory Objects

Some objects are accessed by only one node at a time, due to external synchronization. As an example, consider a distributed quicksort, in which an array of numbers is divided into subarrays which are assigned

Figure 16: Migratory object typed as migratory

to various nodes for sorting. While the subarray is being sorted, only one node is accessing it. Afterward, it is passed back to the parent node for merging with the other sorted subarrays. The merge process then also takes place on a single node. Objects that are accessed by a single node at a time in this manner are called *migratory*.

Migratory objects are managed with an owner-based protocol, which was independently developed by us and Herlihy and Warres [\[18\]](#page-38-6). A remote access causes the transfer of the entire object to the accessing node, which becomes the new owner. Objects also have a home node, which is only used for locating them. A nonlocal access to a migratory object passes through the home node, and then on to its final destination. When a migratory object is moved, it notifies the home node of the new location of the object. The notification is asynchronous, so there is a possibility that the home node will forward a message on to a node that no longer owns the object. For this reason, each node maintains a forwarding pointer when a migratory object moves.

We measured access times for migratory objects that the system has correctly identified as migratory. Such objects suffer three network latencies when the first access is made; one to the home node, one from the home node to the current owner, and one to transfer the object to the requesting node. However, subsequent accesses are purely local, and therefore extremely cheap. In Figure [16,](#page-29-0) we show the average cost of an access, based on the average number of accesses made by each node before the object is transferred to the next node. As the number of such accesses rises, the cost of migrating the object is amortized over a greater number of operations, leading to better average performance.

On the other hand, incorrectly typing a migratory object as a general object causes the system to miss out on opportunities for making a larger number of local accesses. If many of the accesses are writes, the system may not even replicate the object, requiring all accesses to cross the network. This can lead to a great deal of unnecessary overhead. For example, accessing a migratory object with the general protocol using approximately 50% reads and 50% writes leads to a cost of about 4.1 milliseconds with the JIT, and about 6.5 milliseconds without the JIT.

Figure 17: Nonlinearizable history

4.4.2 General Objects

General objects are those that have not been classified as any other type. They are managed with a replicating home-based protocol, developed by Lee [\[22\]](#page-38-7) from a replication scheme described by Wolfson, Jajodia, and Huang [\[46\]](#page-39-11). Objects are permanently located at a home node, chosen when the object is created. Temporary replicas may exist at other nodes. Read accesses are local, if a local copy exists; otherwise, they are sent to the home node. Write accesses always go to the home node, which serializes them and sends them to the replicas.

Furthermore, to ensure linearizability, the writing node must wait until all replicas have been updated. Otherwise, a scenario like the following can occur. Suppose that x and y are integer objects, initially containing zero. Suppose further that node 1 is the home node of x, and also holds a replica of y , and that node 2 is the home node of y, and also holds a replica of x. Consider the history of Figure [17.](#page-30-0) First node 1 writes to x and node 2 writes to y , but neither waits until the replicas have been updated. Before that update takes place, each reads its replica of the other object. Since read operations are purely local, each reads the initial value, zero. The resulting history cannot be linearized (or even serialized, for that matter).

Replicas are created at nodes that issue many read requests. An analysis given by Lee in [\[22\]](#page-38-7) shows that a replica is desirable when 3 times the number of local reads exceeds the number of remote writes. However, we want to avoid the network traffic necessitated by continually sending access counts to the home node. The scheme we use is to count writes at the home node (since all write operations are serialized by the home node anyway), and report the current write access count to each replica as it is updated. Read counts are maintained at each copy. The home node notices when the read count for a node is high enough to warrant a replica, and sends that replica. Each replica then watches its own access count, and removes itself if the number of local reads becomes too low. To avoid thrashing, where a replica is repeatedly created and removed, we do not examine the replication scheme on every access. Instead, we choose a period (which is a tunable parameter of the Kan system), and adjust the replication scheme after that many accesses to the object.

To show the effects of replication, we access a general object in phases, where each phase consists of solely read accesses or solely write accesses. A replica is created part way through the read phase, after the next replication period elapses, resulting in cheap local accesses for the rest of that phase. When the write phase begins, the cost of the operations initially goes up, since the system is now keeping 2 copies of the object consistent. Eventually, after another replication period elapses, the system removes the replica, thereby cheapening the writes in the remainder of that phase. Our results are shown in Figure [18.](#page-31-0)

As with migratory objects, incorrect typing can have enormous impacts on the performance of the system. We forced a general object (one which is accessed randomly by the nodes of the system) to be managed with the migratory protocol. The result is that extra object movement costs are paid on nearly every access. In fact, almost all accesses result in the sending of several messages. First, the home node is contacted to find the current whereabouts of the object. Then the home node forwards the message to the last owner it knew about. However, many messages have to be forwarded since the object is constantly moving. Once a request finally reaches the object, the object migrates to the requesting node, and the access is performed. The results are shown in Figure [19.](#page-31-1) Note the general upward trend. This is a result of an increasing backlog, increasing the size of the request queue transmitted with the object.

Figure 18: Replication of a general object

Figure 19: General object typed as migratory

4.4.3 Type Detection and Conversion

Detecting the type of an object statically (i.e., at compile time) is difficult. In some cases, it is impossible, since the type of the object may depend on user actions. For example, in a distributed editor, shared files may be encapsulated as objects. Their types depend on whether those sharing them access them sequentially or concurrently.

Therefore, we use a dynamic (i.e., runtime) type detection scheme. Objects are initially assigned the migratory type. Access statistics are gathered as in the description of general objects above. However, during each time period, we also record whether any concurrent accesses were detected. This happens if a request arrives while another is being serviced. At the end of each time period, we recompute the object type with this algorithm:

If there are no replicas then

The object is migratory iff there were no concurrent accesses

Else if there is exactly one replica then

The object is migratory iff there were no local accesses on the home node

Else

The object is general

If the object type changes, then we must switch between an owner-based and a home-based protocol. Note that switching from a home-based to an owner-based protocol implies that there is at most one replica. In that case, the holder of the replica (or the home node if there is no replica) becomes the owner. In the other direction, we maintained a home node for migratory objects for locating purposes, so we simply drop the owner information.

4.5 Applications

To determine the impact of the Kan optimizations on real applications, we implemented several and ran with the optimizations enabled and disabled. The thread pool provides uniform improvements, of varying degrees, depending on the number of concurrently executing threads spawned by any one application. Those that spawn only a few at a time always found a thread waiting in the pool, resulting in the greatest overall benefit. On the other hand, some parallel applications, such as matrix multiplication, tend to fork a number of threads initially, then run the entire application with just that set of threads. Such applications see a small reduction in the startup time, but receive no benefit from the thread pool during the main part of the execution.

Pointer swizzling was found to be effective for a distributed quicksort application. An array of numbers is to be sorted. At each step, a number, called the *pivot*, is chosen. Then the array is divided into subarrays, one containing all numbers less than the pivot, one containing all numbers equal to the pivot, and one containing all numbers greater than the pivot. Quicksort is then recursively called on the first and third subarrays. The results are joined together in order to form the final sorted array. The distributed version simply acts on a distributed array, with the stride a parameter that can be chosen by the user. Pointer swizzling helps near the bottom of the sorting tree, as the subarrays to be sorted become small enough to fit entirely within a block assigned to some node. With a small number of nodes, the recursive calls quickly reach a level where all further calls are local. There, executions with pointer swizzling enabled run in as little as 4% of the time of those with pointer swizzling disabled. As the number of nodes rises, the optimization has lesser effect. With 16 nodes, the optimized execution time was approximately 60% of the unoptimized execution time.

Object typing helps with a distributed B-Tree application. B-Trees, in their various forms, are useful data structures for finding data that is too large to fit into a computer's memory. We adapt them to another

use: find data that is distributed across a system. We use a modified B^* -Tree, called the B^{link} -Tree [\[23\]](#page-38-8), for this purpose. Each node in the tree contains a link pointer to its sibling to the right (if any). When searching through the tree, if we find that the highest key in the currently visited node is lower than the search key, we follow the link pointer to the right to continue the search. Node splitting is effected by locking the node to be split, creating the new node, setting the right links appropriately, redistributing the keys, inserting the newly created node into the parent node, and then releasing the lock on the child. This design allows searchers to continue their operations while node splitting is taking place. The tree nodes may be either migratory or general, depending on dynamic searching and inserting behavior of the users. We simulated both kinds of behavior. We found that the adaptive typing code was able to reduce the cost of multiple searches for the same key by replicating the nodes from the root down to the node containing the key. On the other hand, if the distributed system machines took turns heavily accessing a small range of keys, the nodes holding the keys in those ranges tended to be identified as migratory, and would move to the site of activity, reducing the cost of such accesses. In the first case, performance improved by about 16% over the execution without replication. In the second case, performance improved by about 24%, since even the expensive writes were purely local operations.

5 Related Work

The choice of primitives adopted in Kan were motivated by a number of concurrent object-oriented languages and systems proposed recently. We discuss some of those languages and system in this section.

A number of recent products (e.g., Sun's [JDBC\)](http://java.sun.com/products/jdbc/) provide a means of connecting Java programs to databases via a standard SQL interface. The Java program has access to a stable persistent store, and can perform database manipulations and queries. In contrast, Kan does not have persistent objects (but see Section [6\)](#page-36-0), but gives a full general-purpose programming language for constructing object queries and manipulators.

The [Aleph Toolkit](http://www.cs.brown.edu/~mph/aleph/doc/home.html) [\[16\]](#page-38-9) provides common primitives and functionalities needed by distributed systems. Its intended use is as a substrate for heterogeneous distributed systems. Aleph programs can start threads on remote processors and join with them, share objects among threads running on different processors (with synchronization and caching handled by the system), and execute simple single-site transaction. Only single-node transactions are supported, without guards or nesting. The coherence model is based on transactional memory [\[17,](#page-38-10) [37\]](#page-39-12). It guarantees sequential consistency, and provides read, write, optimistic read, and optimistic write accesses. The code organization and general approach of the Aleph Toolkit are similar to the lower layers of the Kan system in many respects, although it does not contain the optimizations discussed in Section [4.](#page-12-0) The Arrow directory protocol [\[18\]](#page-38-6) used by the Aleph Toolkit is the same protocol we use to control migratory objects (see Section [4.4.1\)](#page-28-2).

One approach to distributing Java programs is to distribute the JVM itself, and run unmodified Java programs on that JVM. This is the idea behind [cJVM](http://www.haifa.il.ibm.com/projects/systech/cjvm.html) [\[1\]](#page-37-10), a JVM for homogeneous clusters of computers on a high-speed network. It was designed to support servers, by distributing the server load across the cluster. Hence, it performs best on applications with a large number of independently executing threads. Like Kan, cJVM transparently replicates objects to improve availability.

[Do!](http://www.irisa.fr/caps/PROJECTS/Do/Do.html) [\[21\]](#page-38-11) aims to automatically generate distributed code from multithreaded program source code. The Java language is not extended, but the user is given an API for providing hints to the compiler about appropriate mappings of threads and objects to distributed system nodes. The generated code uses standard Java RMI for communication. It uses a runtime library that supports the creation and manipulation of remote objects.

[JavaParty](http://wwwipd.ira.uka.de/JavaParty/) [\[35\]](#page-39-7), like Kan, is an extension to Java. It gives transparent remote objects, bypassing the complexity of RMI. It also transparently migrates objects for greater availability. Currently, migration is triggered at runtime when access patterns indicate that it is needed, or it is explicitly invoked by the programmer. Future developments to JavaParty include compiler analysis to statically determine when migration is helpful. Also like Kan, JavaParty compiles down to standard Java bytecode, allowing JavaParty programs to run on any JVM. It also supports easy integration of standard Java class files, compiled externally to the JavaParty system. The JavaParty project has produced improved Serialization [\[34\]](#page-39-13) and RMI [\[31\]](#page-38-12) implementations. We intend Kan to be usable on any Java platform, so we have not used these improved substrates in our measurements. However, JavaParty's serialization implementation could be used to improve the message-sending time of Kan.

[Javelin](http://www.cs.ucsb.edu/research/superweb/) [\[13\]](#page-37-11) is an attempt to harness the raw processing power available on the Internet. The goal is to run large-scale coarse-grained parallel applications by dividing the computation among a large set of machines connected to the Internet. The machines with an application to be executed are the *clients*. The machines with processing power to spend on an application are the *hosts*. Bringing clients and hosts together is the job of the *brokers*. The entire system is based on a web browser interface. Users who wish to participate as either clients or hosts point their web browsers to a broker and select the appropriate link. Fault tolerance consists of restarting portions of the application that were assigned to faulty processes. The original Javelin system used Java applets communicating over Java sockets, which use TCP/IP. A later revision of the system, called Javelin++ [\[30\]](#page-38-13), changed to using Java applications communicating over Java RMI, and made some other changes relating to scalability.

[Manta](http://www.cs.vu.nl/manta/) [\[39\]](#page-39-14) was built by the same group responsible for Orca (see below). Based on their experience with JavaParty, they implemented an RMI that is improved still farther over that of JavaParty [\[27\]](#page-38-14). This RMI's efficiency arises in large part from abandoning the official Sun protocol in favor of a more compact, but less versatile, protocol. Hence, a Manta system has to detect whether it is connected to another Manta system, allowing it to use the compact protocol, or not, forcing it to use the standard Sun RMI protocol. Much of Manta's performance improvement derives from their implementation of a native compiler, and the whole-program analysis used by that compiler. Furthermore, the compiler takes special actions when compiling RMI code so that JNI (Java Native Interface) calls are avoided. In fact, communication is inlined into the code, increasing the speed and responsiveness of the system still further. Manta's approach is not portable across JVMs, so is not used in Kan.

The goal of the [Nile](http://www.nile.cornell.edu/) [\[36\]](#page-39-15) project is to provide a self-managing, fault-tolerant, heterogeneous system composed of hundreds of commodity workstations, with access to a distributed database whose size is on the order of hundreds of terabytes. The component workstations are distributed across the North American continent. Nile is intended to be easily maintainable, scalable, and provide useful services past its development phase. It is structured to run embarrassingly parallel applications; i.e., those with independent parallel subtasks, such as web indexers. It is written in Java for heterogeneity. CORBA is used as a data management layer. The database itself is widely distributed, with replication providing some degree of fault tolerance. The failure of a job is automatically detected, and the job is restarted if the failure can be repaired or worked around. The basic operation of Nile is to divide the application into subparts and distribute those subparts to the constituent computing nodes, then collect and collate the results. If a subpart fails, recovery consists of assigning the subpart to a new computing node.

[Parallel Java](http://charm.cs.uiuc.edu/research/pjava/) [\[20\]](#page-38-15) is an extension to the Java language to support parallel constructs. It is based on earlier work on a C++ extension, called Charm++. The parallel extensions provide for the creation of remote objects via proxies, with automatic load balancing. Objects with a port on every node are called *object groups*, and allow for easy expression of algorithms requiring global coordination, such as barriers. Parallel Java is part of a larger effort, named [Converse,](http://charm.cs.uiuc.edu/research/converse/) which is aimed at providing multilingual parallel support. That is, Parallel Java programs can interact with parallel libraries written in other languages supported by Converse. Like Kan, Parallel Java aims to run on any JVM. Therefore, both systems use Serialization and Parallel Java also uses Reflection. While neither Serialization nor Reflection is known for good performance, these features provide portable means of accessing remote objects. However, they are more general than needed

for either project.

[ProActive PDC](http://www-sop.inria.fr/oasis/ProActive/) [\[11\]](#page-37-12) (formerly known as Java//) is a library for Parallel, Distributed, and Concurrent programming in Java. The idea is to run the same program as a sequential application, a multithreaded single-node application, and a distributed application. Rather than alter the Java language, ProActive PDC is entirely API-based, needing no special compiler or JVM. The programmer provides hints to the system through its API, and also uses the API to get implicit futures (using wait-by-necessity), continuations (a transparent delegation mechanism), and active objects. Running a program on the different kinds of platforms supported by ProActive PDC is achieved through object composition. The user defines a sequential object, which the system then composes with a proxy and a so-called *body*. The proxy turns local calls into messages, which are decoded by the body. Futures and continuations are provided by creating specialized subclasses of user objects which contain the appropriate code.

[Cilk](http://supertech.lcs.mit.edu/cilk/) [\[14\]](#page-37-13) is an algorithmic, multithreaded language that compiles to ANSI C. The runtime system guarantees predictable performance. It features an architecture- and language-independent checkpointing facility based on source-to-source translations. Code is structured into procedures. Each procedure consists of one or more nonblocking threads. The dependencies among threads form a rooted DAG. Shared data consistency is defined on this DAG [\[6\]](#page-37-14). Load sharing takes place through randomized work stealing, in which a node with nothing to do asks a random neighbor for a task. There is an online data-race detector, which is intended to be used as a debugging tool. The Kan model technically allows restricted threads of the sort employed by Cilk. However, the actual implementation cannot use such threads, since threads can enter arbitrary (local) Java code. Furthermore, Kan consistency is defined at the object level, for which the DAG approach is inappropriate, since it requires breaking encapsulation to make all dependencies explicit.

[Distributed Oz](http://www.ps.uni-sb.de/Projects/perdio.html) [\[40\]](#page-39-4) is a distributed version of the higher-order concurrent constraint language Oz. Oz objects combine stateful data abstraction with mutual exclusion and synchronization, including a dataflow synchronization construct that is similar to Kan's guard statement. It was inspired by concurrent logic programming, which led to the inclusion of logic variables and constraints in the language. It targets symbolic processing and problem-solving applications. Distributed Oz adds several features, such as a language construct for specifying object mobility patterns.

[Orca](http://www.cs.vu.nl/orca) [\[4\]](#page-37-5) provides globally accessible objects (actually abstract data types), which are manipulated by way of operations. The objects are not shared in the usual sense. Sharing of objects arises through passing references to the objects into processes when they are created. Operations on global objects are atomic; that is, they act as though a lock were held on the object for their entirety. The system distinguishes between read locks and write locks, allowing multiple readers to proceed concurrently. Operations affect a single object only. Continuations are available to support concurrent operations.

Guard expressions can be given, which block an operation from beginning until they are satisfied. Multiple guards can be given for an operation, each with an associated program block. When any guard is true, one is selected nondeterministically, and its associated code is executed.

Orca uses a combination of compile-time and run-time techniques to determine user access patterns. It then switches between a fully replicated scheme, a single-copy scheme, and a migratory scheme to try to yield the greatest possible efficiency.

The system is built on top of Panda, a portable communication system. It is layered to provide heterogeneity, by allowing the system administrator to tune the Orca runtime system to the underlying architecture.

The Orca language, which compiles to ANSI C, is used on the Orca system. This language provides a class-like construct (abstract data types) from which object instances are created at runtime. However, the language is object-based rather than object-oriented; it does not support inheritance or dynamic binding, and there is non-object data in the system. The language is type-secure. That is, all language rule violations are detected by the compiler or the runtime system (e.g., out-of-bound array references or references to deallocated memory).

Orca advertises sequential consistency, but it actually provides the stronger condition of linearizability,

via its combination of locks and totally ordered broadcast. Consistency is maintained by:

- 1. Replicating read-only objects to any node that asks for a copy;
- 2. Not replicating certain objects, so that all operations on them are via RPC; and
- 3. Making all communication go through a totally ordered multicast, so that operations are seen at all replicas in the same order.

The replication strategy is chosen by keeping read/write access counts. The ratio that represents the switchover point is chosen based on RPC and broadcast costs; hence, it varies with each platform. Only two options are considered: full replication and no replication. The project members state that experiments showed that this strategy produced better performance on their system than dynamic replication.

6 Conclusion and Future Work

The Kan system provides the programmer with powerful tools for writing parallel and distributed applications. These tools include asynchronous method calls, and nested atomic transactions with guards. In this paper we have shown that, in spite of the power of the tools provided, reasonable performance can be provided in a system that scales well on a LAN of up to 16 nodes. We have also shown that this performance can be obtained on top of Java sockets, bypassing RMI. In fact, using RMI to provide the same distributed object services results in greater latencies. Coupled with RMI's distinction between local and remote method call semantics, implementors of distributed systems face a tradeoff between the ability to interface with other systems employing RMI and providing replicating and migrating objects more cheaply than RMI is able to do so.

Performance of Kan is enhanced with several optimizations that are applicable to other systems of this kind. The thread pool is an oft-implemented construct that reduces the cost of creating threads. Even this simple construct provides a measurable increase in performance. We have also implemented a thread inlining feature, which turns asynchronous method calls into synchronous method calls to avoid thread context switch costs. This optimization is not universally applicable, since in the extreme it would serialize an application. However, it can provide substantial savings when a parent thread spawns many short-lived children. Pointer swizzling nearly eliminates the overhead of managing global objects when those objects are local to the caller, giving close to Java method call performance. Finally, the typing of objects allows the system to reduce the number of remote method calls made. As the number of local calls climbs, the other optimizations have a greater chance to make an impact, resulting in still further improvements in performance.

In the future, we intend to further develop Kan and explore further performance-enhancing optimizations. For example, object typing is based on the principle that one should maximize the number of method calls that are local. Extending this principle, we find that many software objects are related, in the sense that they make many method calls on one another. In such cases, it is desirable to ensure that the related objects are always colocated. Such colocation gives the method calling optimizations a greater opportunity to have an effect, resulting in still further boosted performance. The analysis necessary to determine when objects are related is a topic of future study.

We also plan to investigate ways of making Kan scalable. Scalability is currently limited by such constructs as the all-to-all socket connections established by the communication layer. While such all-to-all connections are fine for LANs such as the one we used for our experiments, they become unrealistic as the number of nodes involved climb into the hundreds and thousands. Instead of maintaining such connections continuously, we plan to manage sockets as resources, closing inactive sockets as needed to make room for connections between newly communicating nodes.

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