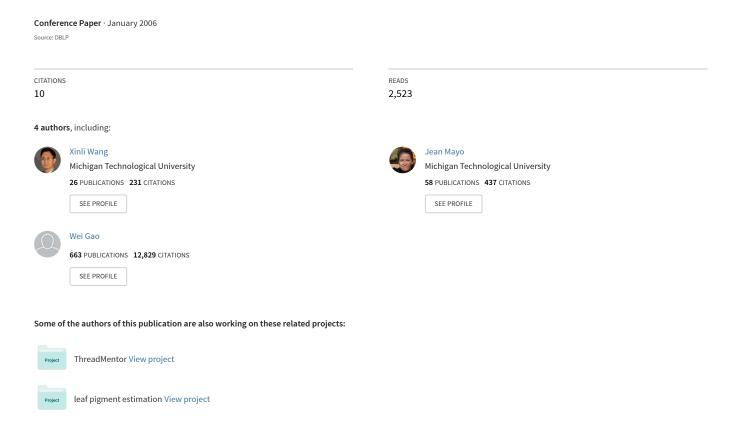
## An Efficient Implementation of Vector Clocks in Dynamic Systems.



### An Efficient Implementation of Vector Clocks in Dynamic Systems

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#### **Abstract**

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A system of vector clocks is strongly consistent and it captures the happened before relations among events in the system. These clocks underlie solutions to a number of problems in distributed systems including, among others, detecting global predicates, debugging distributed programs, causally ordering multicast messages, and implementing a distributed shared memory. In general, a data structure of size n, where n is the number of processes in the system, has to be maintained at each process and attached with each message communicated in the system to implement vector clocks. This is a considerable communication overhead in large systems. A differential technique has been proposed to reduce this required communication overhead for static systems with FIFO channels.

In this study, the differential technique is improved to further reduce the required communication overhead. A protocol is proposed to maintain a virtual network topology of a logical ring combined with multiple computation trees so that the differential technique can be applied to dynamic systems. When a process leaves the clock maintained at this process is taken over by another one in the system. At the time a process joins the system, it will inherits the causality relations maintained at the process that creates the new process. Correctness of the protocol and the clock properties are proved as well.

Key words: vector clock, differential technique, dy-

#### 1. Introduction

Ordering the events occurring in a distributed computation is fundamental to reasoning, analyzing, and drawing inferences about the computation [5, 9, 12]. Fidge [3, 4] and Mattern [10] independently proposed vector clocks to capture Lamport's happened before relation [9], which expresses the ordering imposed by the sequential execution of events at each process and the message passing that takes place among processes and is commonly used to order these events. Although this mechanism has a limitation when vector timestamps are used to reconstruct a distributed computation where message overtaking may occur [6], it is strongly consistent [12] and provides a way to precisely capture the whole causality relationships between events occurring in a distributed computation [1, 4, 5, 10, 12]. Vector clocks have been applied to many problems in distributed systems, such as detecting global properties, debugging distributed programs, ordering multicast messages, and implementing a distributed shared memory.

One drawback in the implementation of vector clocks is the required communication overhead. When a message is transferred an overhead of size n is added. For a big system this overhead is considerable, especially when processes can be created and may terminate dynamically because of the unlimited increase in

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the vector size with process creation. Although some alternatives are available for vector clocks under certain constraints [7, 11, 14, 16], a data structure of size n is necessary to capture the causal relationships between the events [2] in asynchronous systems.

One approach to reduce the communication overhead is the "differential technique" which was discussed by Fidge [4] and developed by Singhal and Kshemkalyani [12, 15] for systems with FIFO channels. Under this technique, when process  $p_i$  sends a message to  $p_j$  only those components of the vector clock at  $p_i$  that have changed since last time  $p_i$  sent a message to  $p_j$  are piggybacked with this message. Hélary *et. al* [8] extended Singhal and Kshemkalyani's protocol for the systems without FIFO channels.

The differential technique can be improved by observing that some of the changed elements were modified because of a message receipt from  $p_j$  and it is therefore not necessary to transfer such changed elements to  $p_j$  when a message is sent to  $p_j$ .

Fidge [4, 5] and Richard [13] independently developed schemes to efficiently implement vector clocks in dynamic systems. However their schemes are good only for special purposes. If multiple processes are leaving the system concurrently, some of the vector clocks maintained at the leaving processes may be lost permanently in both Fidge's and Richard's schemes.

In this study we extend the differential technique to implement vector clocks in dynamic systems. This implementation improves the Singhal and Kshemkalyani's technique so that the communication overhead is further suppressed. A protocol for process creation and termination is proposed and integrated into the implementation so that the vector clock maintained at a leaving/terminating process will not be lost in the case when multiple processes leave the system or terminate concurrently.

#### 2. System Model

A distributed system is modeled with a finite set of processes running on geographically separated machines that are connected with a communication network. The processes cooperate and coordinate through message passing. All processes are not faulty. We assume reliable asynchronous communications over the network. Messages are reliably delivered to their correct destination processes in the order when they were sent. Message delay is finite but unpredictable.

A distributed computation in such a system starts with a nonempty set of processes, which are called initial processes. We assume that the initial processes are connected with a logical ring and each of them knows its neighbors. If the edges  $(p_i, p_j)$  and  $(p_j, p_k)$  exist on the logical ring, then  $p_i$  is called the up stream neighbor and  $p_k$  the down stream neighbor of  $p_i$ . In the progresses of the computation, new processes can be created, external processes can join, and existing processes can leave the system at any time. We assume that at least one initial process exists until the computation terminates. As the computation progresses, a dynamic network topology of multiple trees will be maintained in the system. Each of the trees is rooted at an initial process. A protocol is superimposed upon the computation to implement vector clocks. Let  $SYS(t) = \{p_1, p_2, \cdots, p_i, \cdots, p_n\}$  be the process set in the system at real time t, where n is the number of processes.

# 3. Implementation of Vector Clocks Using Improved Differential Technique

As Hélary *et. al* [8] suggest, we assume that all of the events executed in the system are relative events in implementing vector clocks.

#### 3.1. Data Structures

The following variables are defined at an arbitrary process  $p_i$ .

 $Parent_i$ : the parent of  $p_i$ . If  $p_i$  is an initial process,  $Parent_i$  holds the ID of  $p_i$ 's up stream neighbor. Otherwise,  $Parent_i$  holds the ID of the process who created  $p_i$  or accepted  $p_i$  while  $p_i$  was joining the system.

 $Child_i$ : the children of  $p_i$ . If  $p_i$  is not an initial process,  $Child_i$  is a set of IDs of the processes that were created or accepted by  $p_i$  when they were joining the system and its initial value is an empty set. For an initial process  $p_i$ , its down stream neighbor is also included in  $Child_i$  as its initial value.

 $Leaving_i$ : a Boolean variable. When  $p_i$  is terminating,  $Leaving_i$  is set to true; otherwise  $Leaving_i$  is set to false.

 $VC_i$  (Vector Clock): vector clock of  $p_i$ . It is a set containing a pair of  $(j,c_j)$  for a process  $p_j$  in the system that has communicated with  $p_i$ . The integer  $c_j$  is the scalar clock at  $p_j$  in the  $p_i$ 's point of view. For convenience we use  $VC_i[j]$  to denote the value of  $c_j$  and  $VC_i(e)$  the vector clock  $VC_i$  right before event e occurs. Initially  $VC_i = \{(i,0)\}$ .

 $LU_i$  (Last Updated): a set of the last updated clocks. It contains a triple of  $(j,k,u_j)$  for a process  $p_j$  in the system with  $u_j$  equal to the value of  $VC_i[i]$  when  $p_i$  last updated  $VC_i[j]$ . The integer k identifies the process to which the last update of  $VC_i[j]$  was related. If this modification was done because of an internal event or a message sending event at  $p_i$ , then k=i. If this modification was made because a message receipt from  $p_s$ , then k=s. We use  $LU_i[j][0]$  to denote the value of k and  $LU_i[j][1]$  the value of  $u_j$ . Initially  $LU_i = \{(i,0,0)\}$ .

 $LS_i$  (Last Sent): a set of the last sent clocks. It contains a pair of  $(j,s_j)$  for a process  $p_j$  in the system with  $s_j$  equal to the value of  $VC_i[i]$  when  $p_i$  last sent a message to  $p_j$ . We use  $LS_i[j]$  to denote the value of  $s_j$ . Initially  $LS_i = \{(i,0)\}$ .

 $TVC_i$  (Terminated Vector Clocks): vector clocks of terminated processes. It is a set of vector clocks that were maintained at terminated processes. Initially  $TVC_i = \emptyset$ .

#### 3.2. Protocol for Updating the Data Structures

In this study, messages fall into two categories: (1) computation messages that are related to the distributed computation; (2) termination and creation notification messages that are transmitted while a process

is terminating or being created. We consider only computation messages in this subsection and the latter will be discussed in the next subsection.

In the following exposition, a differential vector clock of  $p_i$  relative to  $p_j$  is defined as a such vector that contains a pair of  $(k,d_k)$  for each process  $p_k$  that the value of  $VC_i[k]$  has been updated since last time  $p_i$  sent a message to  $p_j$  and this modification was not made because of a message receipt from  $p_j$ . For simplicity we use the term differential vector clock only if the interpretation is clear from the context.

The protocol for a process  $p_i$  to maintain its local data structures is described as the following rules. Each rule consists of certain actions  $p_i$  must take right before it executes a specific event.

**Rule1 (R1):** Right before an event is executed at  $p_i$ ,  $p_i$  sets  $VC_i[i] \leftarrow VC_i[i] + 1$ ,  $LU_i[i][0] \leftarrow i$ , and  $LU_i[i][1] \leftarrow VC_i[i]$ .

**Rule2 (R2):** When  $p_i$  sends a message msg to a process  $p_j$ ,  $p_i$  updates  $VC_i[i]$ ,  $LU_i[i][0]$ , and  $LU_i[i][1]$  according to rule **R1**, constructs the set  $msg \cdot VC = \emptyset$  as follows:

$$orall (k,c_k) \in VC_i$$
 if  $(LS_i[j] < LU_i[k][1]) \land (LU_i[k][0] \neq j)$   $\land (k \neq j)$  then

 $msg \cdot VC \leftarrow msg \cdot VC \cup \{(k,VC_i[k])\};$  and attaches  $msg \cdot VC$  to the message. Finally,  $p_i$  sets  $LS_i[j] \leftarrow VC_i[i]$  before the message is sent. If  $(j,s_j) \notin LS_i$ , the operation  $LS_i[j] \leftarrow VC_i[i]$  becomes  $LS_i \leftarrow LS_i \cup \{(j,VC_i[i])\}.$ 

The set  $msg \cdot VC$  is the differential vector clock of  $p_i$  relative to  $p_j$  and is attached to the message msg. The condition  $LU_i[k][0] = j$  indicates that  $VC_i[k]$  was modified due to a message receipt from  $p_j$ , while  $LS_i[j] < LU_i[k]$  means that  $VC_i[k]$  has been updated since last time  $p_i$  sent a message to  $p_j$ . In addition, we do not need to transfer  $VC_i[j]$  to  $p_j$  because  $p_j$  has already known this. Therefore  $msg \cdot VC$  is constructed to contain the elements of  $VC_i$  that have been updated since last time process  $p_i$  sent a message to  $p_j$  except (1) this modification was made because of a message receipt from  $p_j$  and (2) the element  $VC_i[j]$ . Note that this exception is an improvement over Sing-

hal and Kshemkalyani's implementation [12, 15].

**Rule3 (R3):** When  $p_i$  receives a message msg from process  $p_j$ ,  $p_i$  extracts  $msg \cdot VC$  from the message. Then  $p_i$  executes the actions that are described in Table 1. First,  $VC_i[i]$  is incremented by one and  $LU_i[i][0]$  and  $LU_i[i][1]$  are updated. Then  $VC_i[k]$ ,  $LU_i[k][0]$ , and  $LU_i[i][1]$  are modified if  $msg \cdot VC[k] > VC_i[k]$  holds.  $LU_i[k][0]$  contains the ID of the message sender and  $LU_i[k][1]$  is set to the updated value of  $VC_i[i]$  if  $VC_i[k]$  gets modified. Immediately

Table 1. Actions for  $p_i$  upon a message receipt from  $p_j$ 

```
\begin{split} VC_{i}[i] &\leftarrow VC_{i}[i] + 1; \\ LU_{i}[i][0] &\leftarrow i; \\ LU_{i}[i][1] &\leftarrow VC_{i}[i]; \\ \forall (k, c_{k}) &\in msg \cdot VC \\ & \text{if } msg \cdot VC[k] > VC_{i}[k] \text{ then} \\ & VC_{i}[k] \leftarrow msg \cdot VC[k]; \\ & LU_{i}[k][0] \leftarrow j; \\ & LU_{i}[k][1] \leftarrow VC_{i}[i]; \end{split}
```

after taking those actions specified in the rules, process  $p_i$  timestamps the corresponding event with the value of  $VC_i$ , which can be used to keep track of causality relationships between the distributed events. If the logged events will be checked one by one in the order as they have been logged, then only the differences from the last logged timestamp need to be stored.

#### 3.3. Process Creation and Termination

To join a system, an external process sends a joining request message to an existing process, the latter may accept this external process according to certain prescribed rules that will not be explained here. After a process is created or accepted, this new process will inherit the current value of the local data structures maintained at the process that creates or accepts the new one. When a process  $p_i$  terminates, the current value of its local data structures will be taken

over by the process that created or accepted  $p_i$  or by one of its ancestors. This is done by running a process creation and termination protocol described in Table 2. We assume that an initial process  $p_i$  starts with  $Leaving_i = false$ .

As shown in Table 2, when a process  $p_i$  creates a new process or accepts an external process  $p_j$ ,  $p_j$  becomes a child of  $p_i$  and the current value of  $VC_i$  is sent to  $p_j$ . Process  $p_j$  inherits the current value of  $VC_i$ ,  $LU_i$ , and  $LS_i$  from  $p_i$ . Since  $p_j$  is created by  $p_i$ ,  $p_i$  becomes the parent of  $p_j$ .  $TVC_j$  is set to an empty set because  $p_j$  is a new process and therefore no termination has been reported yet to  $p_j$ .

The procedure for a process to terminate is a little more complex. Before a process  $p_i$  terminates, it transfers the current value of  $VC_j$ ,  $TVC_j$ , and  $Child_j$ to  $p_i$ 's parent through a Transfer message and notifies  $p_i$ 's children their new parent by sending them a NewParent message. Note that  $TVC_i$  contains the vector clocks that were maintained at those processes who have reported termination to  $p_i$ . Upon knowing that  $p_j$  is leaving,  $p_j$ 's parent,  $p_i$ , takes over the causality dependence transferred from  $p_i$  by recording this information in  $p_i$ 's local data structure  $TCV_i$  if  $p_i$  is not leaving. Then  $p_i$  sends an acknowledgment back to  $p_j$ . Process  $p_j$  terminates when it receives an AckTransfer message from its parent. The complexity of this procedure arises from the situation in which while  $p_j$  is leaving its parent may also be leaving. This situation is learned by  $p_i$  when it receives a NewParent message from its current parent. In this case  $p_i$  will send a Transfer message again to its new parent and notify its children their new parent. These actions repeat until  $p_i$  receives an acknowledgment for its Transfer message from its parent and then terminates.

#### 4. Correctness Arguments

In this section we will prove the properties of vector times that are useful in capturing causality relationships between distributed events.

Table 2. Actions for process creation and termination

```
Process Creation:
      When p_i creates or accepts p_j, do the following:
            Child_i \leftarrow Child_i \cup \{j\};
            send a message Init(VC_i, LU_i, LS_i) to p_i;
      When p_i receives a message Init(VC_i, LU_i, LS_i) from p_i, do the following:
            Parent_i \leftarrow i;
            Child_i \leftarrow \emptyset;
            Leaving_i \leftarrow false;
            VC_j \leftarrow VC_i \cup \{(j,0)\};
            LU_j \leftarrow LU_i;
            LU_j[j][0] \leftarrow j;
            LU_j[j][1] \leftarrow 0;
           LS_j \leftarrow LS_i \cup \{(j,0)\};
TVC_j \leftarrow \emptyset;
Process Termination:
      //We assume Parent_i \neq j, otherwise p_i cannot terminate.
      When p_i terminates, do the following:
            Leaving_j \leftarrow true;
            send a message Transfer(TVC_j \cup \{VC_j\}, Child_j) to process Parent_j;
            \forall k \in Child_j, send a message NewParent(Parent_j) to process k;
      When p_i receives a Transfer(TVC, Child) message from p_i, do the following:
           if (Leaving_i = false) \lor (Leaving_i = true \land Parent_i = j \land i < j) then
                 TVC_i \leftarrow TVC_i \cup TVC;
                                                                      //p_i is not allowed to terminate if
                 Child_i \leftarrow Child_i \cup Child;
                                                                      //p_i and p_j are the only two initial
                 send an AckTransfer() message to p_j; //processes and i < j to ensure that
                 if Leaving_i = true then
                                                                  //at least one initial process exists.
                        Leaving_i = false;
            else ignore this message;
      When p_i receives a NewParent(Parent) message from p_j, do the following:
            Parent_i \leftarrow Parent;
            if Parent_i = i \land i > j \land Leaving_i = true then
                 clean up all local variables and terminate;
            else if Leaving_i = true then
                 \forall k \in Child_i, send a message NewParent(Parent_i) to process k;
                 if Parent_i = i then
                        Leaving_i \leftarrow false;
                 else
                       send a message Transfer(TVC_i \cup \{VC_i\}, Child_i) to process Parent_i;
      When p_i receives an AckTransfer() message from process Parent_i, do the following:
            clean up all local variables and terminate;
```

**Lemma 4.1** When process  $p_i$  receives a computation message msg from  $p_j$ , the differential vector clock  $msg \cdot VC$  contains all of the elements of  $VC_j$  whose value may be greater than that of the corresponding elements of  $VC_i$  at the moment when the message was sent.

**Proof** This follows directly from the rules described in **R1**, **R2**, and **R3** for maintaining the data structures at each process, constructing a differential vector clock, and the requirement to attach the differential vector clock to the message from  $p_j$  to  $p_i$ .

When  $p_j$  sends a message to  $p_i$ , the condition  $VC_j[k] > VC_i[k]$  could hold if and only if  $VC_j[k]$  has been updated since last time a message was sent from  $p_j$  to  $p_i$  or since  $p_j$  was initiated if  $p_j$  has never sent a message to  $p_i$ . In addition, if this modification was made because of a message receipt from  $p_i$ , then the condition  $VC_j[k] > VC_i[k]$  will not hold according to rule  $\mathbf{R3}$  because in this case the condition  $VC_j[k] \leq VC_i[k]$  must be satisfied. In other words, the elements of  $VC_j$  that may satisfy the condition  $VC_j[k] > VC_i[k]$  include only those of them that have been modified since last time  $p_j$  sent a message to  $p_i$  and the modification was not done because of a message receipt from  $p_i$ .

**Theorem 4.2** Let e and e' be two events,  $e \rightarrow e' \iff VC(e) < VC(e')$ .

**Proof** This follows directly from Lemma 4.1 and and the proofs by Fidge [4] and Mattern [10].

**Theorem 4.3** When a process  $p_j$  is created or accepted by  $p_i$ ,  $p_j$  inherits the current value of  $VC_i$  at the moment  $p_i$  creates or accepts  $p_j$ .

**Proof** This follows directly from the process creation protocol described in Table 2 and the assumption of an FIFO channel.

**Theorem 4.4** When a process  $p_j$  terminates, another process  $p_i$  in the system will take over the current value of  $VC_j$  at the moment when  $p_j$  terminates.

**Proof** This follows directly from the process termination protocol described in Table 2 and the assumption of FIFO channels

#### 5. Efficiency Analysis

As proposed by Singhal and Kshemkalyani [15], we define the *efficiency* of the proposed technique as the average percentage reduction in the size of vector clock related information to be transferred with a message as compared to when sending the entire vector. The following terms are defined for this purpose:

 $A_p$ : The average number of entries in a differential clock that are transferred with a message using the proposed technique.

 $A_s$ : The average number of entries in a vector clock that are qualified for transmission with a message when the technique proposed by Singhal and Kshemkalyani [15] is used.

According to the rules to construct the differential clock for transmission in a message, the following inequality holds.

$$A_p \le A_s. \tag{1}$$

The modification of an element of  $VC_i$  is made only because of (1) an internal event or a message sending event at  $p_i$ , (2) a message receipt from a process other than  $p_j$ , and (3) a message receipt from  $p_j$ . In Singhal and Kshemkalyani's proposal, all of the modifications are included in the differential vector clock, while the proposed technique includes only the modifications made in the first two cases. Equation (1) proves the improvements of our implementation over Singhal and Kshemkalyani's protocol [15].

In addition, the following inequality holds.

$$A_p \le n \tag{2}$$

 $B_s$ : The number of bits to code the value of  $VC_i[j]$ .

 $B_p$ : The number of bits that are needed to code a process ID. Assuming that a process ID is represented with an integer number, then  $B_p = log_2 n$ .

When a vector clock is attached to a message, the

elements of this vector need to be identified even if the entire vector is transferred. The number of bits for each entry of the vector is  $(B_p + B_s)$  and it is the same as when the entire vector is transferred in a dynamic system. Therefore the efficiency of the differential technique (E) is defined as follows:

$$E = \left(1 - \frac{(B_p + B_s) \times A_p}{(B_p + B_s) \times n}\right) \times 100\%$$
$$= \left(1 - \frac{A_p}{n}\right) \times 100\%. \tag{3}$$

From equation (3) we know that the differential technique is always beneficial because of equation (2).

#### 6. Conclusions

We have developed a differential technique to implement vector clocks in dynamic systems. The implementation is an extension of Singhal and Kshemkalyani's protocol [12, 15] and is theoretically more efficient than their protocol in reducing the required communication overhead. Correctness of the proposed technique has been proved.

When a process  $p_j$  is created or accepted by  $p_i$ ,  $p_j$  inherits  $p_i$ 's vector clock with the value when  $p_i$  creates or accepts  $p_j$ . When a process  $p_k$  terminates, some process in the system will take over  $p_k$ 's vector clock with the value when  $p_k$  terminates. These actions of inheritance and takeover are guaranteed even when several processes terminate concurrently.

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