# Characterization of Consistent Global Checkpoints in Large-Scale Distributed Systems \*

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#### Abstract

Backward error recovery is one of the most used schemes to ensure fault-tolerance in distributed systems. It consists, upon the occurrence of a failure, in restoring a distributed computation in an error-free global state from which it can be resumed to produce a correct behaviour. Checkpointing is one of the techniques to pursue the backward error recovery. As we consider large-scale distributed systems, on one side a coordinated approach to take checkpoints is not practicable, on the other side for an uncoordinated approach the probability to have a domino effect during a recovery could be no longer negligible. In this paper, we present a framework that allows first to define formally the domino effect and second to state and prove a theorem to determine if an arbitrary set of checkpoints is consistent. This theorem is very general as it considers a semantic including missing and orphan messages. This plays a key role in designing uncoordinated checkpointing algorithms that require to take as less additional checkpoints as possible in order to ensure domino-free recovery.

## 1 Introduction

Error recovery in computer systems is a task that involves restoring an error-free state from an erroneous one. Error recovery schemes are usually classified into forward and backward error recovery [11]. Forward error recovery is based on attempting to make further use of the state which has just been found to

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be in error. This is possible when the nature of the error and consequences of faults can be completely assessed. Then one can remove those errors and enable the system to move forward. Usually forward error recovery strategies are based on the use of error correcting techniques and codes, or error compensation providing suplementary information. Backward error recovery involves, first, backing up one or more of the processes of the system to a previous state, which is hoped to be error-free, before attempting to continue further operations. In this scheme it is not necessary to foresee the nature and consequences of all the faults, and to remove all the errors. Thus, it makes possible to recover from an arbitrary fault simply by restoring an appropriate previous state to the system. These features enable backward recovery to be considered as a general recovery mechanism to any type of fault. However, backward recovery needs recovery points, i.e., effective means by which a state of a process can be saved and later restored. For obtaining such recovery points one of the basic techniques is checkpointing. It consists in determining, during a computation, a set of local checkpoints (i.e. a set of local states saved in stable storage), from which, upon a failure occurrence, a rolled back computation can be resumed. All distinct pairs of such local checkpoints must be mutually consistent in order that the resumption be feasible. Informally, mutually consistency among local checkpoints ensures that the resumed computation will be semantically correct.

Many algorithms have been proposed to compute consistent checkpoints. They can be classified into two main families according to the coordination employed to take checkpoints. In the coordinated approach [6] processes coordinate explicitly, by means of control messages, the determination of their local checkpoints in order to be mutually consistent. Algorithms that adopt this approach can be seen actually as improvements or adaptations of snapshot algorithms [3] to the checkpointing problem. For each

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process the last checkpoint taken is always the local state in which the process must be restored if a failure causes its rollback.

The basic characteristic of the uncoordinated approach [1, 13, 15] is that processes take checkpoints more or less independently. However, this approach can be divided into two classes according to the possible occurrence of the domino effect [10] during rollback recovery. The domino effect appears when a subset of processes, which have to be resumed after a failure, rollback unboundedly while determining a set of mutually consistent checkpoints. The first class assume pessimistically that the domino effect could occur and then taking enough checkpoints or logging enough messages is necessary in order not to be subjected to the domino effect [13, 5]. Generally, the more checkpoints and messages are stored in stable storage the less rollback is necessary to determine a set of mutually consistent checkpoints. The second family assume optimistically that the probability of the combined event "failure of a process" and "domino effect" is very close to zero. In these algorithms, processes log only few messages [15]. If a failure occurs, the rollback recovery procedure has to determine from the checkpoints previously taken, a set of mutually consistent local states for the processes which have to be restarted, but this determination is not guaranteed a priori due to the risk of domino effect.

From a performance point of view, these two approches show an evident tradeoff between the overhead during a distributed computation and the overhead during a recovery. Coordinated checkpointing add to distributed computations checkpointings, message loggings and control messages, thus performances of failure-free computations are penalized in proportion to their size. On the other hand, upon the occurrence of a failure, each process knows the local state in which it must rollback. Taking checkpoints in the uncoordinated approach impose very few overhead during a failure-free distributed computation (e.g. checkpoints may be taken when processes are idle). Upon the occurrence of a failure, the rollback is not a priori guaranteed to succeed (i.e., some processes can be rolled back unboundedly) when considering "optimistic" algorithms. In "pessimistic" algorithms there could be a bounded rollback of some processes. However, the rollback is costly in terms of control messages and this cost can be proportional to the size of the distributed computation.

As we consider large-scale distributed systems, from previous considerations the coordinated approach is not practicable. At the same time, if the number of processes increases, the probability of the event "failure of a process" and "domino effect" could be no longer negligible. Thus, the uncoordinated approach ensuring domino-freeness seems to be the more appropriate one to cope with large-scale distributed systems.

This paper intends to provide a general framework for intrinsic analysis of backward recovery when considering checkpoints as recovery points. First, we focus on the concept of consistent checkpoints and address very carefully their consistency issues, which are central in backward recovery techniques. At this end, it is shown that, when a recovery semantics is associated with messages, the set of local checkpoints from which a resumed computation can be consistently restarted is enlarged. This leads to revisit the notions of orphan and missing messages by considering the semantic of messages (defined at the application level) and additional underlying mechanisms available on channels (implemented at the system level). Second, we prove a theorem (actually a necessary and sufficient condition) to determine if an arbitrary set of checkpoints is consistent; this condition is very general as it allows to accept or to deny orphan or missing messages in a consistent set of local checkpoints. Further, we give an interesting corollary on useful checkpoints, we show that our framework includes the zigzag relation introduced by Netzer and Xu [9] and we give a formal definition of the domino effect (the domino effect is usually described only at the operational level). This framework plays a key role in designing uncoordinated domino-free checkpointing algorithms that takes as less checkpoints as possible [2] and in defining efficient recovery strategies in the presence of bounded domino effect.

The paper is structured into four main sections. Section 2 presents the model of asynchronous distributed executions and introduces the concept of checkpoint interval. Section 3 investigates thoroughly problems related to the presence of orphan and missing messages in a resumed computation, showing their influence on the definition of global checkpoint consistency. Section 4 presents the theorem to determine if an arbitrary set of checkpoints is consistent and the corollary on useful local checkpoints. Finally, Section 5 points out the modelling of the domino effect.

# 2 System Model

#### 2.1 Distributed Computations

A distributed computation consists of a finite set P of n processes  $\{P_1, P_2, \ldots, P_n\}$  that communicate and synchronize only by exchanging messages. We assume

that each ordered pair of processes is connected by an asynchronous reliable and directed logical channel whose transmission delays are unpredictable but finite. Each process runs on a processor and processors do not have a shared memory, there is no bound for their relative speeds and they fail according to the fail-stop model [12].

A process can execute internal, send and delivery statements. An internal statement does not involve communication. When  $P_i$  executes a send statement send(m) to  $P_j$  actually it puts the message m into the channel from  $P_i$  to  $P_j$ . When  $P_i$  executes the statement delivery(m), it is blocked till at least one message (directed to  $P_i$ ) has arrived; then a message is withdrawn from one of its input channel and delivered to  $P_i$ . Executions of send and delivery statements are modeled by send and delivery events.

Processes of a distributed computation are sequential, in other words, each process produces a sequence of events. This sequence of events is called the history of  $P_i$ , and it is denoted by  $h_i = e_i^0 e_i^1 \dots e_i^s, \dots$ , where  $e_i^s$  is s-th event executed by  $P_i$  ( $e_i^0$  is a fictitious event that initializes  $P_i$ 's local state). Let  $h_i^s$  denote the partial history of  $P_i$  till the event  $e_i^s$ ;  $h_i^s = e_i^0 e_i^1 \dots e_i^s$  is a prefix of  $h_i$ . Events local to a process are totally ordered. However, the set of all the events of the computation is only partially ordered. Let " $\rightarrow$ " denote the causal precedence (happened-before) partial order defined as follows ([7]):

**Definition 2.1**  $e_i^s \rightarrow e_i^t$  if and only if:

- 1. i = j and t = s + 1, or
- 2.  $i \neq j$  and  $e_i^s$  is the sending event of message m and  $e_j^t$  is the delivery event of m, or
- 3. there is an event  $e_k^u$  such that  $e_i^s \to e_k^u \wedge e_k^u \to e_i^t$ .

Let H be the set of all the events produced by a distributed computation; this computation is modeled by the partial order  $\widehat{H} = (H, \to)$ . Let e be an event of  $\widehat{H}$ ; the causal past of e is the subset of  $\widehat{H}$  including all events e' such that  $e' \to e$ .

Moreover, we consider that processes execute programs which can have non-deterministic statements (i.e., processes' histories cannot be entirely predicted by programs these processes execute). Let us note that this process's behaviour includes, but is not limited to, the *piecewise deterministic* one presented in [14] where the only cause of non-determinism is due to the unpredictability of message transmission delays.

#### 2.2 Checkpoints and Intervals

#### 2.2.1 Checkpoints

Let  $\sigma_i^0$  be the initial state of process  $P_i$ . The event  $e_i^s$  moves  $P_i$  from the local state  $\sigma_i^{s-1}$  to the local state  $\sigma_i^s$ . The local state  $\sigma_i^s$  corresponds to the local history  $h_i^s$ ; by definition  $e_i^x$  belongs to  $\sigma_i^s$  if i=j and  $x \leq s$ . Figure 1 shows a distributed computation in the usual space-time diagram where local states of processes are depicted by rectangular boxes. A global state is a set of local states one for each process.

A local checkpoint C is a local state of a process\* and the set of all local checkpoints is a subset of all local states. Whether a local state is or not a local checkpoint does not depend on the computation itself; checkpoints are determined by an underlying protocol which is superimposed on the computation [4]. In the following we consider a distributed computation  $\widehat{H}$  and a set of local checkpoints  $C_{\widehat{\mathcal{H}}}$  defined on  $\widehat{H}$ .  $C_i^s$  represents the s-th checkpoint taken by process  $P_i$  and corresponds to some local state  $\sigma_i^x$  with  $s \leq x$ . Figure 1 shows a correspondence between local states and checkpoints of process  $P_i$ . We assume that each process takes an initial checkpoint  $C_i^0$ , corresponding to  $\sigma_i^0$ , when it starts.

#### 2.2.2 Checkpoint Intervals

Using an abstraction level defined by checkpoints, any two successive checkpoints  $C_i^s$  and  $C_i^{s+1}$  of process  $P_i$  define an interval. We call checkpoint interval  $S_i^s$  the set of events produced by process  $P_i$  between  $C_i^s$  and  $C_i^{s+1}$  (including the event that produced the local state corresponding to  $C_i^s$ ). As an example, Figure 1 depicts the interval  $S_i^s$ .

# 3 Backward Recovery and Global Checkpoints

#### 3.1 Backward recovery

Consider distributed computations of a given distributed program, in which fail-stop events can occur. Such an event is a consequence of a system crash implied by an error in a fail-stop processor on which a process runs. Recall that, when an error occurs in a fail-stop processor, it is halted and the content of its volatile storage is lost. To tolerate such faults, backward error recovery can be applied. In the case of

<sup>\*</sup>At the operational level a local checkpoint is a local state that has been stored in stable storage; we say "a process has taken a local checkpoint".

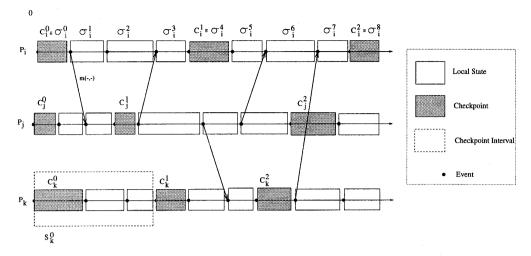


Figure 1: Example of a distributed computation.

checkpointing, this technique refers to restoring processes of a distributed computation to previous checkpoints, saved on stable storage, from which this computation can be resumed leading to consistent global states of the restarted computation, not necessarily equivalent to the failed one (e.g. if the program has non-deterministic statements).

#### 3.2 The concept of global checkpoints

A global checkpoint is defined as a set of local checkpoints, one for each process. Let us note that a global checkpoint constitutes a global state of the computation. In general, different global checkpoints are available. In the context of recovery, we are only interested in consistent global checkpoints, whose precise definition needs to introduce the notion of resumed computation and the concept of orphan and missing messages.

#### 3.3 Faulty and Resumed computations

In order to address more precisely the issue of global checkpoint consistency, let us introduce some terms. The computation in which a fail-stop event occurs will be called the *faulty computation*; this computation stops in a global state. The backward recovery technique implies that processes are rolled back to local checkpoints forming a consistent global checkpoint. The computation including all events produced till this global checkpoint plus events produced after resumption from this global checkpoint constitute the *resumed computation*. As an example Figure 2

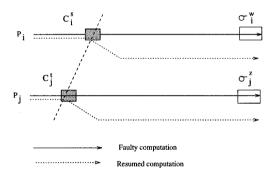


Figure 2: Faulty and Resumed Computation.

shows a distributed computation, formed by two processes, that stops in the global state  $\{\sigma_i^w, \sigma_j^z\}$  and rolls back to the consistent global checkpoint  $\{C_i^s, C_j^t\}$  from which the resumed computation can restart.

#### 3.4 Orphan and Missing Messages

#### 3.4.1 Orphan messages

Upon the occurrence of a failure, let us suppose  $P_i$  and  $P_j$  be restarted from checkpoints  $C_i^s$  and  $C_j^t$  respectively.

**Definition 3.1** A message m sent by  $P_i$  to  $P_j$  is called orphan with respect to the ordered pair of local checkpoints  $(C_i^s, C_j^t)$  if its delivery event belongs to  $C_i^t$  while its sending event does not belong to  $C_i^s$ .

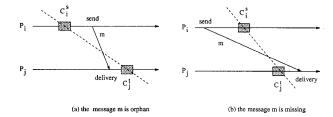


Figure 3: Orphan and Missing messages.

An example of orphan message is shown in Figure 3.a. when considering  $send(m) \notin C_i^s$  and  $delivery(m) \in C_j^t$ . When the computation restarts from  $C_i^s$  and  $C_j^t$  according to the non-deterministic behaviour of  $P_i$  two cases are possible:

- i) the event send(m) is re-executed in the resumed computation: the message m is delivered two times to P<sub>j</sub> affecting then P<sub>j</sub>'s local state twice. However, if the multiple delivery of m, at the application level, does not affect P<sub>j</sub>'s correctness [8] or if, at the system level, an additional underlying mechanism discarding duplicated messages is available [5] then the message m, orphan with respect to (C<sub>i</sub><sup>s</sup>, C<sub>j</sub><sup>t</sup>), will no longer remain orphan with respect to ordered pairs of checkpoints (C<sub>i</sub><sup>x</sup>, C<sub>j</sub><sup>y</sup>) with x > s and y ≥ t as in the resumed computation m has been sent once and received once;
- ii) the event send(m) is not re-executed in the resumed computation: then the message m remains definitely orphan.

In some cases the application can tolerate orphan messages [8]. Even though the application does not tolerate orphans, as seen above, when the system can recover from such messages they can be momentarily tolerated since they will no longer remain orphan in the future.

#### 3.4.2 Missing messages

Upon the occurrence of a failure, let us suppose  $P_i$  and  $P_j$  be restarted from checkpoints  $C_i^s$  and  $C_j^t$  respectively.

**Definition 3.2** A message m sent by  $P_i$  to  $P_j$  is called missing with respect to the ordered pair of local checkpoints  $(C_i^s, C_j^t)$  if its sending event belongs to  $C_i^s$  and its delivery event does not belong to  $C_i^t$ .

An example of missing message is shown in Figure 3.b. where  $send(m) \in C_i^s$  and  $delivery(m) \notin C_j^t$ . When the computation restarts from  $C_i^s$  and  $C_j^t$  according to the non-deterministic behaviour of  $P_i$  two cases are possible:

- iii) the event delivery(m) is re-executed in the resumed computation: in order that this reexecution be feasible, the message m (as its sending is not re-executed) has to be recorded by the sytem level or logged somewhere on noncorrupted storage. If this recording has not been done the message m remains missing;
- iv) the event delivery(m) is not re-executed in the resumed computation: then m remains missing forever.

As previously, in some cases the application can tolerate missing messages.

Even though the application does not tolerate missings, when the system can recover from such messages (by considering states of channels [3, 5, 6, 13]) missings can be momentarily tolerated since they will no longer remain missing in the future.

# 3.5 Analyzing Consistency of Global Checkpoints

An ordered pair  $(C_i^s, C_j^t)$  is consistent if all messages sent by  $P_i$  to  $P_j$  till  $C_i^s$  have been delivered to  $P_j$  before  $C_j^t$ . The previous discussion (cases i,ii,iii,iv) shows that, in some circumstances, such a pair  $(C_i^s, C_j^t)$  could be considered consistent even though it includes sending events of messages and not the corresponding delivery events or vice versa. To allow such possibilities, messages are tagged and the formal definition of consistency takes such tags into account. Next Subsections introduce tagging of messages and consistency of global checkpoints.

#### 3.5.1 Tagging of messages

A tag is associated with each message; it indicates if the message can be orphan and/or missing with respect to pairs of local checkpoints. Each message is tagged with a pair of tags  $(cb_-o, cb_-m)$ , leading to four different status: orphan or missing, orphan but not missing, missing but not orphan, neither orphan nor missing. Thus, four basic types of message deliveries are possible:

• Exactly once message delivery (messages are tagged (\_, \_), i.e., messages cannot be either orphan or missing),

- At least once message delivery (messages are tagged (cb\_o, \_), i.e., messages can be orphan but not missing),
- At most once message delivery (messages are tagged (-, cb\_m), i.e., messages can be missing but not orphan),
- No constraint on message delivery (messages are tagged (cb\_o,cb\_m), i.e., messages can be either missing or orphan).

Tags can be set either by the application itself, by a compiler or by the underlying system:

static tagging: a message, that for the application's semantic can be orphan, will be tagged cb-o by this application or by the compiler. Consequently, if this message is orphan with respect to a pair of checkpoints, it may remain orphan in the future.

dynamic tagging: if the system maintains information about the behaviour of the application (e.g. deterministic, piecewice deterministic or non-deterministic) and it is able to discard duplicates, then the system can tag messages  $cb_{-}o$  as it ensures they will remain no longer orphans in the future.

The same discussion holds for tagging messages as missing  $(cb_{-}m)$ .

#### 3.5.2 Consistency of a global checkpoint

The definition of the consistency of global checkpoint lies on tags associated with each message. These tags allow to introduce a reflexive relation of exclusion, denoted  $\stackrel{ex}{\rightarrow}$ , on local checkpoints. Let us consider  $C_i^s$  informally, the relation  $C_i^s \stackrel{ex}{\rightarrow} C_j^t$  means that no consistent global checkpoint can include a pair of local checkpoints  $C_i^x$  and  $C_j^y$  with  $x \leq s$  and  $y \geq t$  respectively. More formally:

**Definition 3.3** Let  $(C_i^s, C_j^t)$  be an ordered pair of local checkpoints.  $C_i^s \xrightarrow{ex} C_j^t$  if and only if there exists a message m such that:

- m is not tagged cb-o and the sending of m belongs to  $C_i^x$  (x>s) and the delivery of m belongs to  $C_j^y$   $(y\leq t)$ , or
- m is not tagged cb\_m and the sending of m belongs to  $C_j^t$   $(y \leq t)$  and the delivery of m belongs to  $C_i^x$  (x > s).

The relation of exclusion shows that a local checkpoint,  $C_i^s$ , excludes another one,  $C_j^t$ , if there exists either a missing or an orphan message which cannot be accepted by the resumed computation restarted from  $C_i^s$  and  $C_j^t$ . As an example, Figure 4 shows that the existence either of the message m', orphan and not tagged  $(cb\_o,\_)$ , or of the message m'', missing and not tagged  $(\_,cb\_m)$ , implies that  $C_i^s$  excludes  $C_i^t$ .

Moreover, from this definition, it is simple to see that  $C_i^s$  excludes  $C_j^t$  implies that all checkpoints that are on the past of  $C_i^s$  exclude, transitively, the ones on the future of  $C_j^t$  as depicted in Figure 4. More formally,

$$C_i^s \xrightarrow{ex} C_i^t \land x \le s \land y \ge t \Rightarrow C_i^x \xrightarrow{ex} C_i^y$$

In that sense, it is worth noting that the relation of exclusion is not symmetric. A counter example is shown in Figure 4 where  $C_i^s \stackrel{ex}{\rightarrow} C_j^t$  but  $\neg (C_j^t \stackrel{ex}{\rightarrow} C_t^s)$ : in fact, the local checkpoint  $C_j^{t-1}$  belonging to the past of  $C_j^t$  does not exclude the local checkpoint  $C_i^{s+1}$  belonging to the future of  $C_i^s$ , since, with respect to the resumed computation restarted from  $C_i^{s+1}$  and  $C_j^{t-1}$ , m' is missing and tagged  $(-,cb_m)$  and m'' is orphan and tagged  $(cb_-o_{,-})$ . However,  $C_i^s$  and  $C_j^t$  cannot clearly belong to the same consistent global checkpoint. We are then able to give the definition of consistency for an ordered pair of local checkpoints and of consistency of a global checkpoint:

**Definition 3.4** An ordered pair of local checkpoints  $(C_i^s, C_i^t)$  is consistent if  $\neg (C_i^s \stackrel{ex}{\rightleftharpoons} C_i^t)$ .

#### Definition 3.5

A global checkpoint,  $\{C_1^{x_1}, C_2^{x_2}, \dots, C_n^{x_n}\}$  is consistent with respect to  $\stackrel{ex}{\to}$  if and only if, for every (i, j) such that  $1 \leq i \leq n, 1 \leq j \leq n$  and  $i \neq j$ , the ordered checkpoint pair  $(C_i^{x_i}, C_j^{x_j})$  is consistent.

# 4 Relation of Precedence on Checkpoint Intervals

This Section defines a relation of precedence, denoted  $\prec$ , on checkpoint intervals. This relation will allow to state a necessary and sufficient condition to determine whether an arbitrary set of local checkpoints can belong to some consistent global checkpoint. Further, we will present an interesting corollary stating when a local checkpoint can belong to some consistent global checkpoint and, finally, we show that our framework includes the *zigzag* relation introduced by Netzer and Xu [9].

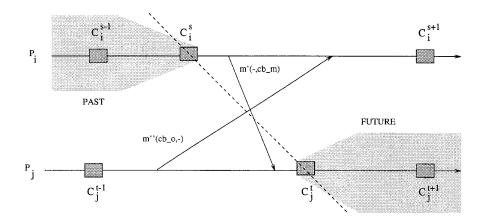


Figure 4: Example of the relation of exclusion.

#### 4.1 Precedence Relation

**Definition 4.1**  $S_i^s$  preceds  $S_j^t$  (denoted  $S_i^s \prec S_j^t$ ) if and only if:

1. i = j and t = s, or

2. i = j and t = s + 1, or

3.  $C_i^s \stackrel{ex}{\rightarrow} C_i^{t+1}$ , or

4.  $\exists S_k^u : S_i^s \prec S_k^u \land S_k^u \prec S_i^t$ .

Note that the relation  $\prec$  is not a partial order (although reflexive and transitive, it is not antisymmetric) and then it can have cycles including distinct checkpoint intervals. As an example, Figure 5 shows the graph of the relation  $\prec$  of the computation of Figure 1 when considering all the messages are tagged (-,-) and where, for clarity's sake, we do not consider transitive precedences due to point 4 of Definition 4.1. In this graph, for example, the edge  $S_i^0 \prec S_j^0$  is due to message m of Figure 1 sent in  $S_i^0$  and delivered in  $S_j^0$  ( $C_i^0 \overset{ex}{\rightarrow} C_j^1$  and m cannot be orphan). The message m implies also the opposite edge  $S_j^0 \prec S_i^0$  ( $C_j^0 \overset{ex}{\rightarrow} C_i^1$  and m cannot be missing).

Before introducing the consistency Theorem, let us note that, since the presence of either an orphan or a missing message is equivalent to state the inconsistency of a checkpoint pair (Section 3.5.2), the graph of the precedence relation  $\prec$  actually represents a broad class of equivalent distributed computations. For example the distributed computation of Figure 6, when considering all the messages are tagged (-,-), is equivalent (with respect to  $\prec$ ) to the one depicted in Figure 1 since they have the same precedence relation graph shown in Figure 5.

## 4.2 Consistency Theorem

**Theorem 4.1** Let  $\mathcal{I} \subseteq \{1, ..., n\}$  and  $\mathcal{C} = \{C_i^{x_i}\}_{i \in \mathcal{I}}$  be a set checkpoints. Then  $\mathcal{C}$  is a subset of a consistent global checkpoint if and only if:

$$(CT)$$
  $\forall i, \forall j : i \in \mathcal{I}, j \in \mathcal{I} :: \neg (S_i^{x_i} \prec S_j^{x_j-1})$ 

#### Proof

**Sufficiency.** We prove that if (CT) is satisfied then C can be included in a consistent global checkpoint. Let us consider the global checkpoint defined as follows:

- if  $i \in \mathcal{I}$ , we take  $C_i^{x_i}$ ;
- if  $i \notin \mathcal{I}$ , for each  $j \in \mathcal{I}$  we consider the integer  $m_i(j) = \min\{y \mid \neg(S_i^y \prec S_j^{x_j-1})\}$  (with  $m_i(j) = 0$  if this set is empty). We take  $C_i^{x_i}$  with  $x_i = \min_{j \in \mathcal{I}}(m_i(j))$ . Thus, by definition,  $\forall j \in \mathcal{I} :: \neg(S_i^{x_i} \prec S_j^{x_j-1})$  and  $\exists k \in \mathcal{I} :: S_i^{x_i-1} \prec S_k^{x_k-1}$ .

We show that  $\{C_1^{x_1}, C_2^{x_2}, \ldots, C_n^{x_n}\}$  is consistent with respect to  $\stackrel{ex}{\to}$ . Assume the contrary. There exists i and j such that  $C_i^{x_i} \stackrel{ex}{\to} C_j^{x_j}$  and thus from point 3 of Definition 4.1 we have:

$$S_i^{x_i} \prec S_j^{x_j - 1} \tag{1}$$

Four cases have to be considered:

- 1.  $i \in \mathcal{I}, j \in \mathcal{I}$ . Relation (1) contradicts the assumption  $\neg (S_i^{x_i} \prec S_j^{x_j-1});$
- 2.  $i \in \mathcal{I}, j \notin \mathcal{I}$ . By definition of  $x_j$  follows that:  $\exists k : k \in \mathcal{I} :: S_j^{x_j-1} \prec S_k^{x_k-1}$ .

By transitivity (using Relation (1)) we have  $S_i^{x_i} \prec S_k^{x_k-1}$  which contradicts the assumption (CT);

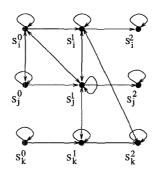


Figure 5: Relation of precedence on checkpoint intervals.

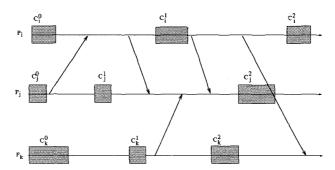


Figure 6: A distributed computation equivalent to the one of Figure 1

- 3.  $i \notin \mathcal{I}, j \in \mathcal{I}$ . Relation (1) contradicts the definition of  $x_i$ ;
- 4.  $i \notin \mathcal{I}, j \notin \mathcal{I}$ . By the definition of  $x_j, \exists k : k \in \mathcal{I} :: S_j^{x_j-1} \prec S_k^{x_k-1}$

By transitivity (using Relation (1)) we have  $S_i^{x_i} \prec S_k^{x_k-1}$  which contradicts the definition of  $x_i$ .

**Necessity.** We prove that if there is a consistent global checkpoint  $\{C_1^{x_1}, C_2^{x_2}, \dots, C_n^{x_n}\}$  including  $\mathcal C$  then property (CT) holds for any  $\mathcal I \subseteq \{1, \dots, n\}$ . Assume the contrary. There exists  $i \in \mathcal I$  and  $j \in \mathcal I$  such that  $S_i^{x_i} \prec S_j^{x_j-1}$ . From the definition of Relation  $\prec$ , there exists a sequence of integer  $i=i_1,i_2,\dots,i_k=j$  and a sequence of checkpoint numbers  $y_1=x_i,y_2,\dots,y_k=x_j$  such that

$$C_i^{x_i} \xrightarrow{ex} C_{i_2}^{y_2}$$
 and  $C_{i_2}^{y_2} \xrightarrow{ex} C_{i_3}^{y_3}$  and ... and  $C_{i_{k-1}}^{y_{k-1}} \xrightarrow{ex} C_j^{x_j}$ 

We show by induction on k that  $\forall t \geq x_j$ ,  $C_i^{x_i}$  and  $C_j^t$  cannot belong to the same global checkpoint<sup>†</sup>.

Base step. k=2. In this case,  $C_i^{x_i} \xrightarrow{ex} C_j^{x_j}$  and thus,  $\forall t \geq x_j, C_i^{x_i} \xrightarrow{ex} C_j^t$ . Consequently,  $C_i^{x_i}$  and  $C_j^t$  cannot belong to the same consistent global checkpoint.

Induction step. We suppose the result true for some  $k \geq 2$  and show that it holds for k + 1. We have:

$$C_i^{x_i} \stackrel{ex}{\to} C_{i_2}^{y_2}$$
 and  $C_{i_2}^{y_2} \stackrel{ex}{\to} C_{i_3}^{y_3}$  and ... and  $C_{i_k}^{y_k} \stackrel{ex}{\to} C_j^{x_j}$ 

From the assumption induction, for any  $t \geq y_k$ ,  $C_i^{x_i}$  and  $C_{i_k}^t$  cannot belong to the same consistent checkpoint. Moreover,  $C_{i_k}^{y_k} \stackrel{\mathcal{E}\mathcal{X}}{\to} C_j^{x_j}$  implies that, for any  $u \leq y_k$ ,  $C_{i_k}^u$  and  $C_j^{x_j}$  cannot belong to the same consistent checkpoint. Therefore, no checkpoint in process  $P_{i_k}$  can be included with  $C_i^{x_i}$  and  $C_j^{x_j}$  to form a global consistent checkpoint.

#### 4.3 Useful Local Checkpoints

The previous Theorem has an interesting corollary which allows to decide whether a local checkpoint can be a member of a consistent global checkpoint:

Corollary 4.2 A checkpoint  $C_i^s$  can belong to some consistent global checkpoint if and only if:

$$\neg (S_i^s \prec S_i^{s-1})$$

<sup>&</sup>lt;sup>†</sup>In the case i=j this relation follows from the reflexivity of relation  $\stackrel{ex}{\rightarrow}$ .

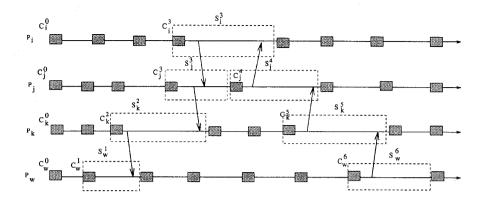


Figure 7: A distributed computation with  $\alpha$ -bounded domino effect

Checkpoints that verify the previous corollary are called useful. Non-useful checkpoints cannot belong to any consistent global checkpoint and they are the direct cause of the rollback that may lead, during a rollback recovery, to the domino effect. For example, checkpoints  $C_i^1$ ,  $C_j^1$  and  $C_k^2$  of Figure 1 are non-useful as it results from Figure 5.

Let us note, finally, that when we consider the particular case where all the messages are tagged  $(-,cb_-m)$ , results of Theorem and Corollary 4.2 simplify and are equivalent to the ones proposed by Netzer and Xu in [9] using the zigzag relation.

# 5 Characterizing the Domino Effect

This section models the domino effect by using the relation of precedence on checkpoint intervals. The domino effect forces processes to rollback unboundedly. Such a "backward progress" of a process, during recovery, is captured by Corollary 4.2 where for non-useful checkpoints we have  $S_i^s \prec S_i^{s-1}$ . In other words, the existence of a non-useful checkpoint  $C_i^s$  means that a checkpoint interval  $S_i^s$  preceds another one  $S_i^{s-1}$  that belongs to its past. As an example, the checkpoint  $C_k^s$  of the distributed computation shown in Figure 1 corresponds to the precedence  $S_k^2 \prec S_k^1$ , transitive consequence of  $S_k^2 \prec S_i^1$  and  $S_i^1 \prec S_k^1$  (Figure 5). This suggests to define the notion of the bounded domino effect:

**Definition 5.1** Let  $\widehat{H}$  be a distributed computation,  $C_{\widehat{\mathcal{H}}}$  be a set of checkpoints defined on  $\widehat{H}$  and  $\alpha \geq 0$  be an integer. The domino effect is  $\alpha$ -bounded in  $C_{\widehat{\mathcal{H}}}$  if

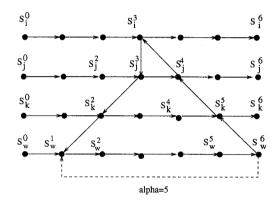


Figure 8: Relation on checkpoint intervals of the computation shown in Figure 7

and only if:

$$\forall P_i \in P : (S_i^s \prec S_i^t \land t < s) \Rightarrow s - t \le \alpha$$

If  $\mathcal{C}_{\widehat{\mathcal{H}}}$  is such that the domino effect is  $\alpha$ -bounded, we say that  $\mathcal{C}_{\widehat{\mathcal{H}}}$  is  $\alpha$ -bounded. Consider, as an example, the distributed computation and its relation on checkpoint intervals  $\prec$  depicted in Figures 7 and 8 respectively (for clarity's sake, all the messages are tagged  $(\neg,cb\_m)$ , and precedences due to reflexivity and transitivity are not shown). In this computation, orphan messages and the useless checkpoint  $C_j^4$  ( $S_j^4 \prec S_j^3$ ) create, by transitivity, the relation of precedence  $S_w^6 \prec S_w^1$  which fixes an upper bound for the domino effect in that computation with these checkpoints:  $\mathcal{C}_{\widehat{\mathcal{H}}}$  is 5-bounded.

 $\mathcal{C}_{\widehat{\mathcal{H}}}$  is defined on the fly by a checkpointing algorithm as  $\widehat{H}$  progresses. So neither  $\widehat{H}$  nor  $\mathcal{C}_{\widehat{\mathcal{H}}}$  are

known in advance. Suppose that, for a given check-pointing algorithm, we are able to produce a non-negative integer  $\alpha$  such that, for any  $\widehat{H}$ , it will produce a set  $C_{\widehat{\mathcal{H}}}$  which is  $\alpha$ -bounded; then, we know that, in case of failure, a recovery will not require processes to rollback unboundedly. This consideration provides the following definition for domino boundedness.

**Definition 5.2** A checkpointing algorithm ensures domino bounded rollback recovery if it is possible to define an integer  $\alpha \geq 0$  such that, for any  $\widehat{H}$ , the set  $C_{\widehat{\omega}}$  produced by this algorithm is  $\alpha$ -bounded.

A particular interesting case is domino freedom:

**Definition 5.3** A checkpointing algorithm ensures domino free rollback recovery if for any  $\widehat{H}$ , the set  $\mathcal{C}_{\widehat{\mathcal{H}}}$  produced by this algorithm is 0-bounded.

## 6 Conclusion

Checkpointing is one of the techniques to pursue backward error recovery in distributed systems. It consists, upon the occurrence of a failure, in restoring a distributed computation in a consistent global checkpoint from which it can be restarted to produce a correct behaviour. In this paper, we have presented a framework that allows first to define formally the domino effect and second to state and prove a theorem to determine if an arbitrary set of checkpoints is consistent; this theorem is very general as it considers a semantic including missing and orphan messages. As, in large-scale distributed systems, neither a coordinated approach (it implies too much synchronization) nor an uncoordinated approach (the probability to have a domino effect during a recovery is no negligible) are practicable, the previous theorem plays a key role in designing uncoordinated checkpointing algorithms that require to take as less additional checkpoints as possible ensuring domino-free recovery.

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