# Design and Evaluation of a Fault-Tolerant Mobile-Agent System

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hen mobile agents travel from one server to another in a network, they transfer their code, data, and execution state to the server. Because they access servers locally, transferring multiple requests and responses across congested network links isn't necessary, thus making overall performance more efficient. Consequently,

This fault tolerance approach deploys three kinds of cooperating agents to detect server and agent failures and recover services in mobileagent systems. mobile agents create a new paradigm for data exchange and resource sharing in rapidly growing and continually changing computer networks.

In a distributed system, failures can occur in any software or hardware component. A mobile agent can get lost when its hosting server crashes during execution, or it can get dropped in a congested network. Therefore, survivability and fault tolerance are vital issues for deploying mobile-agent systems. The "Related Work" sidebar discusses various approaches in these areas.

Our method,<sup>1</sup> rooted in the approach of Dag Johansen and his colleagues,<sup>2</sup> employs three types of agents to detect server and agent failures and recover services in mobile-agent systems. An actual agent is a common mobile agent that performs specific computations for its owner. Witness agents monitor the actual agent and detect whether it's lost. A probe recovers the failed actual agent and the witness agents. A peer-to-peer message-passing mechanism stands between each actual agent and its witness agents to perform failure detection and recovery through time-bounded information exchange; a log records the actual agent's actions. When failures occur, the system performs rollback recovery to abort uncommitted actions.3 Moreover, our method uses checkpointed data to recover the lost actual agent.<sup>4</sup>

## System architecture and protocol design

Researchers have exploited various server failuredetection-and-recovery (FDR) strategies to bring failed servers back online. However, these strategies don't recover a lost actual agent if it resides on the failed server when the failure occurs. Therefore, we need a more advanced approach to reinitialize lost agents.

Figure 1 shows the overall design of our agent server architecture, which can recover lost agents. The agent server should provide three types of stable storage-for logs, checkpoints, and messages. Every server logs the actions that an agent performs. The logged information is vital for failure detection and recovery. Moreover, the hosting servers log which objects the system has updated. When a server failure occurs, the system should recover the agent that was lost due to the failure. However, each agent contains its internal data, which could also be lost due to the failure. In addition, if the agent renews its computation from the starting point of its itinerary, it will violate the exactly-once property. Therefore, the system must checkpoint each agent's data, thus requiring a way to permanently store that checkpointed data. Furthermore, our protocol for agent failure detection and recovery is based on message passing and message logging. To detect and recover an actual agent's failures, the witness agent monitors whether the actual agent is alive or dead (that is, lost). When the actual agent completes its dedicated work on a server and resumes its journey to the next server, it spawns a new witness agent at the current server. We've also designed a communication mechanism between agents and servers.

Assume an actual agent has just arrived at server  $S_i$ . Also, assume that a witness agent was spawned at server  $S_{i-1}$  before the actual agent left that server. We denote the actual agent as  $\alpha$  and the witness agent as

 $\omega_{i-1}$ . Because the actual agent plays an active role in our proposed protocol, we discuss its activity first.

Figure 1 shows the action flow that  $\alpha$  performs at server  $S_i$ . After  $\alpha$  arrives at  $S_i$ , it immediately writes an arrival entry,  $\log_{arrive}^i$ , into the logs of the permanent storage in  $S_i$ (Step 1). This log entry provides evidence that  $\alpha$  has successfully reached this server. Next,  $\alpha$  informs  $\omega_{i-1}$  that it has safely arrived at  $S_i$  by sending a message,  $ms_{arrive}^i$ , to  $S_{i-1}$ (Step 2).  $S_{i-1}$  keeps the received message in its message box. Then,  $\alpha$  performs its dedicated tasks at  $S_i$ . When it finishes, it immediately checkpoints its internal data (Step 3).

We assume that the checkpointing action is one of the actual agent's computations. So, if the checkpointing action fails, the actual agent aborts the entire transaction. This step is important because it guarantees that the checkpointed data will be available if the actual agent has already finished computing. Moreover, it's essential for recovering a lost actual agent. Next,  $\alpha$  logs another  $\log_{\text{leave}}^{i}$ entry in  $S_i$  (Step 4). This entry expresses that  $\alpha$  has completed its computation and is ready to travel to the next server,  $S_{i+1}$ . In the following step,  $\alpha$  sends  $\omega_{i-1}$  another message, msg<sup>*i*</sup><sub>leave</sub>, to inform  $\omega_{i-1}$  that  $\alpha$  is ready to leave  $S_i$  (Step 5). After sending the leave message,  $\alpha$  spawns a new witness agent at the current server (Step 6). Finally,  $\alpha$  leaves S<sub>i</sub> and travels to  $S_{i+1}$ . This procedure continues until  $\alpha$ reaches the last destination in its itinerary.

On the other hand, witness agent  $\omega_{i-1}$  is more passive than the actual agent in this protocol. It doesn't send any messages to the actual agent. Instead, it simply waits to receive messages from the local mailbox. Two messages are expected: msg<sup>i</sup>arrive and  $msg_{leave}^{i}$ . One advantage of receiving these two types of messages through a mailbox is that the mailbox provides a history record that they've arrived at this server. Additionally, the mailbox provides a mechanism to shuffle messages, and it only lets msgiarrive pass before  $msg_{leave}^{i}$ . If the messages are out of order, the mailbox detains msgieave in permanent storage, and  $\omega_{i-1}$  will not consume this message. The mailbox's message record helps recover the lost witness agent and the actual agent. After receiving these two indirect messages,  $\omega_{i-1}$  waits for the direct heartbeat message,  $msg_{alive}^{i}$ , which the witness agent at server  $S_i$  sends. This message confirms the liveness of  $\omega_i$ . Thus, a witness agent undergoes three states after being spawned, as Figure 2 shows.

### **Related Work**

Extensive research has occurred in the areas of survivability and fault tolerance. Stefan Pleisch and André Schiper adopt the use of replication and masking,<sup>1</sup> employing replicated servers to mask failures. Manfred Dalmeijer and his colleagues use a checkpoint manager to monitor all agents.<sup>2</sup> This manager is responsible for tracking all agents and restarting those that have failed. Taha Osman, Waleed Wagealla, and Andrzej Bargiela analyze an execution model for agent platforms to develop a pragmatic framework for fault tolerance in agent systems.<sup>3</sup> This framework deploys a communication-pair, independent-checkpointing strategy. Simon Pears, Jie Xu, and Cornelia Boldyreff use two exception-handling approaches operating on different servers to maintain mobile agents' availability.<sup>4</sup> Luis Moura Silva, Vitor Batista, and Joao Gabriel Silva present a set of fault tolerance techniques, including fault detection, checkpointing and restart, software rejuvenation, and reconfigurable itinerary.<sup>5</sup> They also discuss issues regarding network partitions.

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Figure 1. Steps in a fault-tolerant mobile-agent server framework: (1) Log entry  $\log_{arrive}^{i}$  (2) Send message msg $_{arrive}^{i}$  to server S<sub>*i*-1</sub>. (3) After computation, checkpoint the data. (4) Log entry  $\log_{leave}^{i}$  (5) Send message msg $_{leave}^{i}$  to server S<sub>*i*-1</sub>. (6) Spawn a witness agent.



Figure 2. Life scenario of witness agent  $\omega_{i-1}$ .



Figure 3. Recovery steps when  $\omega_{i-1}$  fails to receive  $msg^i_{arrive}$ : (1) The witness agent spawns a probe, which travels to S<sub>i</sub>. (2) The probe carries the checkpointed data. (3) The probe inspects the log in S<sub>i</sub>. (4) If  $\log^i_{arrive}$  is found, the probe retransmits  $msg^i_{arrive}$  to S<sub>i-1</sub>. (5) If not, it recovers the agent from the checkpointed data.

#### Agent failure detection and recovery

The purpose of log entries  $log_{arrive}^{i}$  and  $log_{leave}^{i}$  and messages  $msg_{arrive}^{i}$  and  $msg_{leave}^{i}$  is to guarantee that the actual agent has finished up to a certain point of its execution. If a server failure occurs between a log entry and its corresponding message, we can determine when and where the actual agent failed. We assume there are no hardware failures such that the log entries can't be recorded in permanent storage. However, other kinds of failures, such as software faults in the mobile agents or in the mobile-agent platforms, can occur. Here, we discuss different types of failures, including loss of the actual agents.

#### $\omega_{i-1}$ fails to receive msg<sup>i</sup>arrive

Witness agent  $\omega_{i-1}$  could fail to receive msg<sup>*i*</sup><sub>arrive</sub> at server S<sub>*i*-1</sub> for one of the following reasons:

- 1. The message is lost due to an unreliable network.
- 2. The message arrives after the timeout period of  $\omega_{i-1}$ .
- 3. Actual agent  $\alpha$  gets lost when it's ready to leave  $S_{i-1}$  and is heading for  $S_i$ .
- Actual agent α gets lost when it arrives at S<sub>i</sub> without logging.
- 5. Actual agent  $\alpha$  gets lost when it arrives at S<sub>i</sub> with logging.

By using arrival entry  $\log_{arrive}^{i}$  logged in  $S_i$ , we can solve the first two problems. The actual agent doesn't die, and  $\log_{arrive}^{i}$  proves the existence of  $\alpha$  inside  $S_i$ . The witness agent can then send out probe  $\rho_i$ , another agent, to search for  $\log_{arrive}^{i}$  in  $S_i$ . If found,

 $\rho_i$  retransmits msg<sup>i</sup><sub>arrive</sub> to recover the lost or delayed message. If  $\omega_{i-1}$  fails to receive msg<sup>i</sup><sub>arrive</sub> because of the loss of  $\alpha$ , there could be a *missing-detection* problem: In Case 5 (the fifth reason just listed), the probe might find log<sup>i</sup><sub>arrive</sub> and, wrongly determining that  $\alpha$  is still alive, terminate itself prematurely. If Cases 3 or 4 cause the failure, the probe won't be able to find log<sup>i</sup><sub>arrive</sub> in S<sub>i</sub>. Then, we should recover the lost actual agent by using the checkpointed data stored in S<sub>i-1</sub>. Therefore, the probe must carry along the checkpointed data when it travels to S<sub>i</sub>.

Figure 3 shows the execution steps to detect agent failures when the witness agent fails to receive msg<sup>*i*</sup><sub>arrive</sub>. Witness agent  $\omega_{i-1}$ waits for message msg<sup>i</sup><sub>arrive</sub> with a configurable timeout period. If the timeout period is reached,  $\omega_{i-1}$  creates probe  $\rho_i$ , which then travels to  $S_i$  (Step 1). Because  $\rho_i$  might have to recover a lost agent, it travels with the checkpointed data (Step 2). Upon arriving at  $S_i$ , it searches the log file in  $S_i$  for entry  $\log_{arrive}^i$ (Step 3). If  $\rho_i$  finds  $\log_{arrive}^i$ , it retransmits  $msg_{arrive}^{i}$  (Step 4). If  $\rho_{i}$  doesn't find the log entry, it recovers  $\alpha$  in S<sub>i</sub> by using the piggyback checkpointed data (Step 5). Finally, the recovered actual agent at  $S_i$  sends message msg<sup>i</sup>arrive.

The system recovers the lost actual agent in  $S_i$  instead of  $S_{i-1}$  because when  $\rho_i$  detects that a recovery is necessary, the system can immediately recover that actual agent in  $S_i$ . If the system performs the recovery in  $S_{i-1}$ ,  $\rho_i$  must send a message to  $S_{i-1}$  to inform  $\omega_{i-1}$  that an agent recovery is necessary. This introduces a risk of losing the critical message.

When  $\omega_{i-1}$  sends out  $\rho_i$ , it waits for another timeout period. This is important because  $\rho_i$  could be lost, the messages retransmitted

from  $S_i$  could be lost, or another successive failure might strike  $S_i$ . Such a failure could terminate both  $\rho_i$  and the just-recovered actual agent. Therefore,  $\omega_{i-1}$  should wait until message msg<sup>i</sup><sub>arrive</sub> arrives.

It's possible for  $\rho_i$  to reach  $S_i$  while  $\alpha$  is still on the way. However, the probability of this case occurring should be low. Because both  $\alpha$  and  $\rho_i$  must travel from  $S_{i-1}$  to  $S_i$  in the same network, they suffer from more or less the same network latency. Although there might be many routes from  $S_{i-1}$  to  $S_i$ , we can set the timeout of  $\omega_{i-1}$  to be large enough to overcome the differences in speed among these routes.

#### $\omega_{i-1}$ fails to receive msg<sup>i</sup><sub>leave</sub>

 $\omega_{i-1}$  could fail to receive msg<sup>*i*</sup><sub>leave</sub> for one of the following reasons:

- 1. The message is lost due to an unreliable network.
- 2. The message arrives after the timeout period of  $\omega_{i-1}$ .
- 3. Actual agent  $\alpha$  gets lost just after sending message msg<sup>*i*</sup><sub>arrive</sub>.
- 4. Actual agent  $\alpha$  gets lost just after logging entry log<sup>*i*</sup><sub>leave</sub>.
- 5. Actual agent  $\alpha$  gets lost after spawning witness agent  $\omega_i$ .

If the failure occurs because of one of the first two reasons, the system can handle it in a way similar to that just discussed. Witness agent  $\omega_{i-1}$  sends probe  $\rho_i$  to search for  $\log_{leave}^i$  in the log file of S<sub>i</sub>. The missing-detection problem could occur if the reason for the failures is Case 4 or 5. We'll discuss the solution to Case 4 later; Case 5 is the same as the case in which  $\omega_i$  can't receive msg<sup>i+1</sup>/<sub>arrive</sub>, which we discussed in the previous subsection.

For Case 3, probe  $\rho_i$  checks whether logieave exists. The absence of logieave implies that the actual agent was lost while performing its computation. (Case 5 of the previous section would fall into this category.) We expect that  $\omega_{i-1}$  won't receive msg<sup>i</sup><sub>leave</sub> after the loss of  $\alpha$ . So, because  $\alpha$  is lost, the system must undo its partially completed task. Therefore, it's necessary to roll back those operations using Markus Strasser and Kurt Pothernel's method for preserving the data consistency in S<sub>i</sub>.<sup>3</sup> The system treats the entire computation process as a single transaction. Because the transaction doesn't fully complete, the system must abort all actions executed in this transaction. The log in S<sub>i</sub> serves to recover the data inside  $S_i$ . Probe  $\rho_i$  doesn't perform the rollback recovery; instead, the system performs this rollback during the server's recovery. Therefore, if the probe can't find log entry  $\log_{leave}^{i}$ , it can immediately use the checkpointed data to recover  $\alpha$ . After the recovery is complete, the recovered actual agent continues to perform its computation in S<sub>i</sub>. This simplifies the agent failure detection mechanism's implementation.

The probe's execution steps when  $msg_{leave}^{i}$ is missing are similar to the steps in Figure 3. Again, the actual agent's recovery occurs in the server expected to host the actual agent that is, in S<sub>i</sub>.

# Failures of witness agents and the recovery strategy

After the actual agent logs entry  $\log_{leave}^{i}$ and before it moves to the next server,  $S_{i+1}$ , it spawns witness agent  $\omega_i$  at server  $S_i$ . The reasons for engaging this witness-agentspawning strategy instead of letting lagged witness agent  $\omega_{i-1}$  move forward to server  $S_i$ are first, to reduce network communication, thus minimizing the chances of agent loss introduced by link failures, and second, to create a chain of witness agents.

As the actual agent proceeds along its itinerary, the system spawns witness agents along the way. The most recently created witness agent monitors the actual agent; the older witness agents monitor the witness agent that's just one server closer to the actual agent in its itinerary. That is, using " $\rightarrow$ " to represent the monitoring relation,

 $\omega_0 \rightarrow \omega_1 \rightarrow \omega_2 \rightarrow \dots \omega_{i-1} \rightarrow \omega_i \rightarrow \alpha$ 

Now, we introduce a server called *home* (the agent owner's machine). The home server transmits agents as they start traveling on the network and receives agents when they finish. We let S<sub>0</sub> denote this home server. Therefore,  $\omega_0$  denotes the witness agent residing at the home server. This *witnessing dependency* can't be broken; otherwise, there'd eventually be no witness agent to monitor  $\alpha$ .

To preserve the witnessing dependency, the witness agents not monitoring the actual agent periodically receive heartbeat messages from the next witness agents. That is,  $\omega_i$  sends a periodic message,  $msg_{alive}^i$ , to  $\omega_{i-1}$ to inform it that  $\omega_i$  is alive;  $\omega_{i-1}$  sends a periodic message,  $msg_{alive}^{i-1}$ , to  $\omega_{i-2}$  to inform it that  $\omega_{i-1}$  is alive; and so on. There are three possible reasons why  $\omega_{i-1}$  can't receive  $msg_{alive}^i$  from  $\omega_i$ :



Figure 4. Witness agent failure scenario: (1) A failure strikes  $S_{i-1}$ , and the witnessing dependency is broken. (2) A failure strikes  $S_i$ , and the actual agent is terminated. (3) The witness agent at  $S_{i-2}$  recovers the witness agent at  $S_{i-1}$ . (4) The witness agent at  $S_{i-1}$  recovers the actual agent at  $S_i$ .

- 1. The network is congested or unreliable.
- 2. The system load of  $S_i$  is too high.
- 3. Witness agent  $\omega_i$  was not created or is lost.

Regardless of the reason,  $\omega_{i-1}$  can always assume that  $\omega_i$  is lost. After timeout,  $\omega_{i-1}$ sends  $\rho_i$  to S<sub>i</sub> to replace the lost witness agent in S<sub>i</sub>. There's no special data stored in the witness agent except the agent itinerary, so this type of probe need not carry the checkpointed data. Because there's a probability of false detection due to Cases 1 and 2, when  $\rho_i$  reaches S<sub>i</sub>, it first checks whether the witness agent is still alive. If no witness agent exists,  $\rho_i$  initializes a new witness agent, which resends message msg<sup>i</sup><sub>alive</sub> to  $\omega_{i-1}$ ; otherwise,  $\rho_i$  just disposes of itself.

Figure 4 illustrates a recovery procedure for a witness agent failure. If  $\alpha$  is in S<sub>i</sub>, then  $\omega_{i-1}$  is monitoring  $\alpha$ , and  $\omega_{i-2}$  is monitoring  $\omega_{i-1}$ . Assume the following failure sequence: First,  $S_{i-1}$  crashes, then  $S_i$ . Because  $S_{i-1}$ crashes,  $\omega_{i-1}$  is lost, so there's no agent to monitor  $\alpha$ . If the system doesn't recover  $\omega_{i-1}$ ,  $\alpha$  is not recoverable after S<sub>i</sub> crashes. This is obviously not desirable, so we need a mechanism to monitor and recover the failed witness agents. We achieve this by preserving the witnessing dependency: Witness agent  $\omega_{i-2}$  can perform the recovery of  $\omega_{i-1}$ , so that eventually  $\omega_{i-1}$  can recover  $\alpha$ . There are other, more complex scenarios, but as long as the witnessing dependency is preserved, agent failure detection and recovery are always possible.

#### Simplifying the witnessing dependency

To maintain the witnessing dependency, the actual agent creates witness agents along its itinerary, and the witness agents exchange heartbeat messages. These procedures consume considerable resources. If, however, no more than k servers can fail at the same time, we can simplify our mechanism by shortening the witnessing dependency. We accomplish this by keeping the witness length less than or equal to k. If  $\alpha$  is at server S<sub>i</sub>, the simplified dependency becomes

If 
$$(i \le k)$$
  
 $\omega_0 \to \omega_1 \to \dots \to \omega_{i-1} \to \alpha$   
Else  
 $\omega_{i-k} \to \omega_{i-k+1} \to \dots \to \omega_{i-1} \to \alpha$ 

Because no more than k servers can fail simultaneously, k witness agents are sufficient to guarantee the availability of  $\alpha$ . When a failure occurs in  $S_i$ ,  $\omega_{i-1}$  can recover  $\alpha$  after the server restarts. When a failure strikes  $S_{i}$ ,  $i - k < j < i, \omega_{j-1}$  will recover  $\omega_j$ . When a failure occurs in  $S_{i-k}$ ,  $\omega_{i-k}$  can't be recovered, so the witnessing dependency decreases by 1. However, when  $\alpha$  travels to S<sub>*i*+1</sub>,  $\alpha$  creates a new witness agent  $\omega_i$ , and a new dependency forms involving  $\omega_{i-1}$ ,  $\omega_i$ , and  $\alpha$ ; thus, the witnessing dependency brings the number of witness agents back to k. Finally, when  $\alpha$ successfully logs entry  $\log_{arrive}^{i+1}$ , the system can terminate  $\omega_{i-k}$  by sending message  $msg_{kill}^{i+1}$  from  $S_{i+1}$  to  $S_{i-k}$ .

#### **Stochastic Petri net models**

Using SPN models and simulations,<sup>5</sup> we evaluated how our agent FDR mechanism improved agent survivability. We denote a mobile-agent system with no fault tolerance as Level 0. For comparison, we introduce a server FDR mechanism. Before  $\alpha$  leaves the current server, it checks whether its next destination server is alive. If yes,  $\alpha$  moves to it; otherwise,  $\alpha$  stays at the current server until the next server comes back to work. If a mobile-agent system engages this server FDR strategy, it's at Level 1. If it additionally embeds the agent FDR strategy, it's at Level 2. We define *agent survivability* as the ratio of successful actual agents (ones that complete their scheduled round-trip journeys) in



Figure 5. A stochastic Petri net model for Level 2.

a network of agent servers divided by the total number of actual agents launched.

#### An example model

Figure 5 shows the SPN that models the mobile-agent system at Level 2. The SPNs for Levels 0 and 1 are subsets of the SPN for Level 2, so they need not appear here. The right-hand box manifests the actual agent's state transitions at a server. Transitions  $t\_a\_m$ ,  $t\_l\_a$ ,  $t\_a\_p$ ,  $t\_l\_l$ , and  $t\_w\_n$  are timed transitions; they model the time to travel between two servers, the time to log the arrival entry, the required computation time inside a server, the time to log the leave entry, and the time to spawn a witness agent, respectively. The unboxed places and transitions on the right side of the figure are for the server itself: *t\_s\_f* models the time to a failure, and t\_s\_r is the time to perform a recovery. (A place is an SPN term similar to a state in a state diagram.) Here, we assume instant failure detection.

We could also model a more realistic, round-robin failure detection approach.<sup>1</sup> When a *token* is at place  $p\_s\_u$ , the server is available. However, if no token is at the place, the server fails, and all agents in that server

are lost. We use inhibitor and guard arcs to model these phenomena. The guard arc from  $p\_s\_u$  to  $t\_a\_m$  prevents actual agents from moving to the server when it fails. The upperleft box shows the witness agent's state transitions. Three places, p\_w\_a, p\_w\_l, and  $p_w_h$ , represent the witness agent's different states waiting for the arrival message, the leave message, and heartbeat messages, respectively. The middle, unboxed area represents the state transition of probes. The system dispatches three types of probes-those for retrieving the arrival message, those for retrieving the leave message, and those for recovering a witness agent. The two places in the lower-left box represent the server's state after sending the arrival and leave messages, respectively, to a witness agent; the actual agent and the probe share these two places. After a server recovers from a failure, this SPN model initializes places  $p_l_a, p_l_l$ ,  $p_m_a$ , and  $p_m_l$  with a token if their corresponding logs and messages are present.

Figure 5 shows different agents' behaviors in one server. However, we can link several servers to form a chain, representing an actual agent's itinerary and the witnessing dependency.

#### **Experimental results**

We conducted our experiments using simulations developed with C-Sim.<sup>6</sup> Some of the parameters were as follows:

- Network transmission rate: 100 for agents, 200 for messages
- Server repair rate, *t\_s\_r*: 0.1
- All message log rates: 100
- Arrival, leave, and heartbeat message bound times: 1, 100, and 20, respectively
- Heartbeat interval: 5

We conducted the experiments using different itineraries with various numbers of servers. These experiments illustrate how well agent survivability improved.

Figures 6 through 8 show the results of using the C-Sim implementation with different server failure and job completion rates. For each parameter pair, we conducted six simulations: one for Level 0 (a mobile-agent system with no fault tolerance); one for Level 1 (the same system but with a server FDR strategy); and four for Level 2 (using both server and agent FDR strategies), each with a different number (k) of witness agents. Figure 6 shows that agent survivability decreases



Figure 6. Agent survivability when (a) the server failure rate is 0.001 and the job completion rate is 0.01, (b) the server failure rate is 0.005 and the job completion rate is 0.01, and (c) the server failure rate is 0.005 and the job completion rate is 0.05.

progressively as the number of servers increases. This is reasonable: As the chance of having to wait for a failed server to recover increases, the probability of an agent failing while it's waiting also increases. The agent FDR mechanism in Level 2 achieves relatively higher survivability than the other two levels. The improvement becomes more significant as the number of servers and the



Figure 7. Number of created witness agents when (a) the server failure rate is 0.001 and the job completion rate is 0.01, (b) the server failure rate is 0.005 and the job completion rate is 0.01, and (c) the server failure rate is 0.005 and the job completion rate is 0.05.

number of witness agents increase. So, to achieve a high percentage of successful agent round trips with more servers, we should increase the number of witness agents correspondingly.

We found one unexpected result. After engaging the server FDR approach (Level 1), the percentage of completed agents was less than it was in Level 1, without fault tolerance



Figure 8. Number of probes when (a) the server failure rate is 0.001 and the job completion rate is 0.01, (b) the server failure rate is 0.005 and the job completion rate is 0.01, and (c) the server failure rate is 0.005 and the job completion rate is 0.05.

mechanisms (see Figure 6). The problem is that in both these levels, when an actual agent fails, there's no way to recover it. So, if an agent finishes its journey more quickly, the chance of it failing decreases. After engaging the server FDR strategy, the actual agent spends more time in the system because it waits at its current server when its next server is unavailable. Consequently, the chances of

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it failing increase. This is true even if we use the agent FDR mechanism and a few witness agents. Comparing Figures 6a and 6b, we see that the higher the failure rate, the higher the agent loss probability. However, if an agent completes its dedicated work at each server more quickly (Figure 6c), survivability increases. This implies that in unreliable systems, actual agents should complete their tasks as quickly as possible.

We achieve Level 2 by engaging witness agents and probes. Figures 7 and 8 show the cost of these additional resources. As Figure 7 shows, the number of created witness agents with Level 2 increases linearly with the number of servers. The higher the num-

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ber (k) of required witness agents, the more witness agents the system creates. Figure 8 shows the number of probes generated during agent execution. The higher percentage of completed agents comes at the cost of more witness agents and probes spawned. This means that as the itinerary becomes longer, more witness agents and probes are necessary, so system complexity increases. The simulation results in Figures 6, 7, and 8 also indicate that there's a trade-off between survivability and overhead cost.

imulation results show that our proposed agent FDR approach improves agent survivability in failure-prone mobile-agent systems. Thus, it can help create a more reliable agent deployment environment. However, this improvement comes at the expense of time and space resources. Therefore, achieving the expected agent survivability affordably is a trade-off that we need to investigate in the future. ■

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