# Application-Layer Multicasting With Delaunay Triangulation Overlays

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Abstract-Application-layer multicast supports group applications without the need for a network-layer multicast protocol. Here, applications arrange themselves in a logical overlay network and transfer data within the overlay. In this paper, we present an application-layer multicast solution that uses a Delaunay triangulation as an overlay network topology. An advantage of using a Delaunay triangulation is that it allows each application to locally derive next-hop routing information without requiring a routing protocol in the overlay. A disadvantage of using a Delaunay triangulation is that the mapping of the overlay to the network topology at the network and data link layer may be suboptimal. We present a protocol, called Delaunay triangulation (DT protocol), which constructs Delaunay triangulation overlay networks. We present measurement experiments of the DT protocol for overlay networks with up to 10000 members, that are running on a local PC cluster with 100 Linux PCs. The results show that the protocol stabilizes quickly, e.g., an overlay network with 10 000 nodes can be built in just over 30 s. The traffic measurements indicate that the average overhead of a node is only a few kilobits per second if the overlay network is in a steady state. Results of throughput experiments of multicast transmissions (using TCP unicast connections between neighbors in the overlay network) show an achievable throughput of approximately 15 Mb/s in an overlay with 100 nodes and 2 Mb/s in an overlay with 1000 nodes.

*Index Terms*—Application-layer multicasting, Delaunay triangulation, group communication, multicasting.

## I. INTRODUCTION

**D** UE TO the lack of a widely available IP multicast service, recent research has examined implementing multicast services in the application layer. The general approach is to have applications self organize into a logical overlay network, and transfer data along the edges of the overlay network using unicast transport services. Here, each application communicates only with its neighbors in the overlay network. Multicasting is implemented by forwarding messages along trees that are embedded in the virtual overlay network.

Application-layer multicast has several attractive features: 1) there is no requirement for multicast support in the layer-3 network; 2) there is no need to allocate a global group identifier,

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such as an IP multicast address; and 3) since data is sent via unicast, flow control, congestion control, and reliable delivery services that are available for unicast can be exploited. A drawback of application-layer multicast is that, since data is forwarded between end systems, end-to-end latencies can be high. Another drawback is that, if multiple edges of the overlay are mapped to the same network link, multiple copies of the same data may be transmitted over this link, resulting in an inefficient use of bandwidth. Thus, the relative increase of end-to-end latencies and the increase in bandwidth requirements as compared with network-layer multicast, are important performance measures for overlay network topologies for application-layer multicast.

Most overlay topologies for application-layer multicast fall into three groups. Topologies in the first group consist of a single tree [8], [9], [12], [15], [26], [29]. A drawback of using a single tree is that the failure of a single application may cause a partition of the overlay topology. The second group of topologies are mesh graphs, where data is transmitted along spanning trees which are embedded in the mesh graph [3], [4]. A drawback of mesh graphs is that the calculation of spanning trees requires running a multicast routing protocol (e.g., distance vector multicast routing protocol [DVMRP]) within the overlay, which adds complexity to the overlay network. Generally, in the aforementioned topologies, nodes in the overlay network send probe messages to each other to measure network-layer latencies. These measurements are used to build an overlay network that is a good fit for the network-layer topology. The third group of topologies assigns to members of the overlay network logical addresses from some abstract coordinate space, and builds the overlay network with the help of these logical addresses. For example, the overlay in [19] assigns each member of the overlay network a binary string and builds an overlay network with a hypercube topology. In [28], logical addresses are obtained from n-dimensional Cartesian coordinates on an n-torus. An advantage of building overlay networks with logical addresses is that, for good choices of the address space and the topology, next-hop routing information for unicast and multicast transmissions can be encoded in the logical addresses. A disadvantage of building overlay networks using a logical address space is that the overlay network may not be a good match for the network-layer topology. Note that recent proposals for location services in peer-to-peer networks have adopted logical coordinate spaces that assign logical addresses to data items, e.g., [27], [31], [32]. Even though lookup services and application-layer multicast services have different objectives, some logical coordinate spaces can be applied in both contexts [28].

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In this paper, we present an application-layer multicast solution that is suitable for very large group sizes with many thousand nodes. Our approach is to use a Delaunay triangulation (DT) as overlay network topology. The choice of the overlay topology falls into the third group of application-layer multicast solutions, which draw logical addresses from a coordinate space. Specifically, each member of an overlay network is assigned logical (x, y) coordinates in a plane. We show that Delaunay triangulations can be built in a distributed fashion, and that multicast trees can be embedded in a Delaunay triangulation overlay without requiring a routing protocol in the overlay. A disadvantage of a Delaunay triangulation overlay is that the mapping of a Delaunay triangulation overlay network to the network-layer infrastructure can be poor, especially if the logical coordinates of a member in the overlay network are not well matched to the underlying network topology.

We present a protocol, called *DT protocol*, which creates and maintains a Delaunay triangulation overlay of applications on the Internet. The DT protocol achieves scalability through a distributed implementation where no entity maintains knowledge of the entire group. We evaluate the DT protocol through measurement experiments for overlay networks with up to 10 000 members on a cluster of PCs. The results show that the DT protocol can maintain a Delaunay triangulation overlay for a multicast group with dynamically changing group membership. In other experiments, we evaluated the performance of the overlay's topology using multicast batch file transfers to groups with up to 1000 members.

The contribution of the presented Delaunay triangulation and the DT protocol is that we can build and maintain very large overlay networks with relatively low overhead, at the cost of suboptimal resource utilization due to a possibly poor match of the overlay network to the network-layer infrastructure. Hence, in terms of John Chuang's taxonomy of scalable services [5], the Delaunay triangulation overlay network trades off economy-ofscale for increased scalability.

The remaining sections are organized as follows. In Section II, we define Delaunay triangulations and Delaunay triangulation overlay networks. In Section III, we compare Delaunay triangulation overlay networks with other proposed overlay network topologies. In Section IV, we describe the DT protocol. In Section V, we present measurement experiments that evaluate the performance of our implementation of the DT protocol. In Section VI, we present brief conclusions.

## II. DELAUNAY TRIANGULATION AS AN OVERLAY NETWORK TOPOLOGY

A Delaunay triangulation for a set of vertices A is a triangulation graph with the defining property that for each circumscribing circle of a triangle formed by three vertices in A, no vertex of A is in the interior of the circle. In Fig. 1, we show a Delaunay triangulation and the circumscribing circles of some of its triangles. Delaunay triangulations have been studied extensively in computational geometry [7] and have been applied in many areas of science and engineering, including communication networks, e.g., [1], [10], [14], [18], [23].



Fig. 1. Delaunay triangulation.

#### A. Delaunay Triangulation Overlay Network

In order to establish a Delaunay triangulation overlay, each application, henceforth called "node," is associated with a vertex in the plane with given (x, y) coordinates. The coordinates are assigned via some external mechanisms (e.g., GPS or user input) and can be selected to reflect the geographical locations of nodes. Two nodes have a logical link in the overlay network, i.e., are *neighbors*, if their corresponding vertices are connected by an edge in the Delaunay triangulation that consists of all vertices associated with the nodes of the overlay.

The Delaunay triangulation has several properties that make it attractive as an overlay topology for application-layer multicast. First, Delaunay triangulations generally have a set of alternate nonoverlapping routes between any pair of vertices. The existence of such alternate paths can be exploited by an application-layer overlay when nodes fail. Second, the number of edges at a vertex in a Delaunay triangulation is generally small. The average number of edges at each vertex is less than six. Even though, in the worst-case, the number of edges at a vertex is n - 1, the maximum number of edges is usually small.<sup>1</sup> Third, once the topology is established, packet forwarding information is encoded in the coordinates of a node, without the need for a routing protocol. Finally, the Delaunay triangulation can be established and maintained in a distributed fashion. We elaborate on the last two properties in the next subsections.

## B. Compass Routing

Multicast and unicast forwarding in the Delaunay triangulation is done along the edges of a spanning tree that is embedded in the Delaunay triangulation overlay, and that has the sender as the root of the tree. In the Delaunay triangulation, each node can locally determine its child nodes with respect to a given tree, using its own coordinates, the coordinates of its neighbors, and the coordinates of the sender.

Local forwarding decisions at nodes are done using *compass* routing [17]. The basic building block of compass routing is that a node A, for a root node R, computes a node B as the parent in the tree, if B is the neighbor with the smallest angle to R. This is illustrated in Fig. 2. Compass routing in general planar graphs

<sup>&</sup>lt;sup>1</sup>The worst case is created when n - 1 vertices form a circle and the *n*th vertex is in the center of the circle.



Fig. 2. Compass routing. Node A has two neighbors, B and C. A computes B as the parent in the tree with root R, since the angle  $\angle RAB = 15^{\circ}$  is smaller than the angle  $\angle RAC = 30^{\circ}$ .



Fig. 3. Compass routing. Node A determines that it is the parent for node C, since the angle  $\angle RCA$  is smaller than angles  $\angle RCD$  and  $\angle RCB$ . Likewise, B and D determine that they are not the parents of node C, since  $\angle RCA < \angle RCB$  and  $\angle RCA < \angle RCD$ .



Fig. 4. Locally equiangular property. The property holds for triangles  $\triangle abc$  and  $\triangle abd$  if the minimum internal angle is at least as large as the minimum internal angle of triangles  $\triangle acd$  and  $\triangle cdb$ .

may result in routing loops [16]. However, compass routing in Delaunay triangulations does not result in loops [17]. Compass routing is also used for determining a multicast routing tree, where nodes calculate their child nodes in the multicast routing tree in a distributed fashion. Specifically, a node A determines that a neighbor C is a child node with respect to a tree with root R, if the edge  $\overline{AC}$  is a border of two triangles, say  $\triangle ABC$  and  $\triangle ACD$  (see Fig. 3), and if selecting A leads to a smaller angle from C to R, than selecting B and D. If each node performs the above steps for determining child nodes, then the nodes compute a spanning tree with root node R.

#### C. Building Delaunay Triangulations With Local Properties

Delaunay triangulations can be defined in terms of a locally enforceable property. A triangulation is said to be *locally* equiangular [30] if, for every convex quadrilateral formed by triangles  $\triangle acb$  and  $\triangle abd$  that share a common edge  $\overline{ab}$ , the minimum internal angle of triangles  $\triangle acb$  and  $\triangle abd$  is at least as large as the minimum internal angle of triangles  $\triangle acd$  and  $\triangle cbd$ . This is illustrated in Fig. 4. In [30], it was shown that a locally equiangular triangulation is a Delaunay triangulation.

In a graph that is a triangulation, each node N can enforce the locally equiangular property for all quadrilaterals formed



Fig. 5. Locally equiangular property for a node N and its neighbors. Node N can enforce the equiangular property for all quadrilaterals formed by N and its neighbors A, B, C, D, E, and F. Here, N can determine that the locally equiangular property is violated for triangles  $\triangle NBC$  and  $\triangle NCD$ . Thus, the edge  $\overline{NC}$  should be replaced by an edge  $\overline{DB}$ .

by N and its neighbors. In Fig. 5, node N can detect that the locally equiangular property is violated for triangles  $\triangle NBC$  and  $\triangle NCD$ , and that the edge  $\overline{NC}$  should be removed and replaced by an edge  $\overline{DB}$ . Thus, N can remove node C as one of its neighbors.

The protocol described in Section IV builds and maintains a Delaunay triangulation overlay by enforcing the locally equiangular property for each node and its neighbors.

## III. COMPARATIVE EVALUATION OF OVERLAY TOPOLOGIES

We next present a comparative evaluation of overlay network topologies for multicasting. The purpose of the evaluation is to determine how well the Delaunay triangulation and other overlay topologies can match the network layer infrastructure. The basis for our evaluation is a software tool for network topology generation [2]. We present results for a Transit Stub topology, which generates a network with a two-layer hierarchy of transit networks and stub networks. The parameters for the topology are as follows. The network consists of four transit domains, each with 16 routers. The routers of each transit domain are randomly distributed over a  $1024 \times 1024$  grid. There are 64 stub domains, each with 15 routers spread over a  $32 \times 32$  grid. Each stub domain is connected to a transit domain router. Links between routers in transit and stub domains are set using the Waxman method [2]. The average number of links per router is approximately three. Hosts are connected to a router of a stub domain and are distributed over a four by four grid with the stub domain router at the center of the grid. The total number of hosts in the entire network is varied from two to 512 hosts, and incremented by powers of two. The hosts are distributed uniformly over the stub domains.

We assume that all unicast traffic is carried on the shortestdelay path between two hosts, where the delay between two hosts is determined by the length of the shortest path in the generated topology. For each generated network topology, we construct a set of overlay networks. Each host participates in an overlay network as a single node. We consider the following overlay topologies.

1) The *Delaunay triangulation* as described in Section II. The coordinates of the nodes are the grid coordinates of the hosts in the generated graph.

2) A *Minimum Spanning Tree (MST)* is an overlay network which builds a shared tree with minimum total delay, as is done in the ALMI protocol [26].



Fig. 6. Stress. (a) Average. (b) 90th percentile.



Fig. 7. RDP. (a) Average. (b) 90th percentile.

3) A *Degree-3 minimum spanning tree* represents a topology which is generated by the Yoid protocol [9]. In this overlay, each node has at most three links. We select a binary tree as an initial topology and use the update procedures described in [9] to improve the tree. We use overlay networks that are the result of 720 rounds of updates.

4) A *Degree-6 graph* represents an overlay network that is similar to those created by the Narada protocol [4]. The algorithm establishes a mesh network where each node has at most six logical links. For multicast delivery, the method uses a DVMRP routing algorithm for building per-source trees [6]. The protocol performs periodic unicast delay measurements and improves the mesh, based on these measurements. We show results for overlay networks which are obtained after 720 rounds of improvements.

5) The *Hypercube* assigns nodes a binary string and arranges nodes in a logical incomplete hypercube. This topology completely ignores the network topology [19]. Data is disseminated using trees which are embedded in the hypercube [21].

For a performance comparison of overlay networks we use the performance metrics *relative delay penalty (RDP)* and *stress*, which have been used in the related literature (e.g., [4]).

• The RDP for two hosts is the ratio of the delay in the overlay to the delay of the shortest-delay unicast path.

•The *stress* of a network-layer link is the number of identical copies of a packet that traverse the link for a given spanning tree embedded in an overlay network. For network-layer multicasting, e.g., IP multicast, both RDP and link stress are equal to

one. We point out that there are many other measures which can be used to evaluate overlay networks, such as the robustness of the topology to link or node failures, the speed of convergence of the overlay topology, and the overhead of the routing protocol in terms of computation and bandwidth needs.

It is important to note that the results for stress and relative delay penalty are dependent on the randomly generated network topology. To account for some of the randomness we present all numerical data as averages from five randomly generated network topologies, where identical parameters are used for each network topology.

In Fig. 6, we show the stress values for various overlays when the number of hosts is varied between two and 512. The results show the average values [Fig. 6(a)], and the 90th percentile values [Fig. 6(b)] for the stress of links. With the exception of the hypercube topology, all overlay topologies show similar values for stress. Fig. 7 depicts the RDP values for all pairs of hosts, as averages [Fig. 7(a)], and 90th percentile values [Fig. 7(b)]. The results show that overlay networks which take into consideration the network-layer topology incur a lower RDP than Delaunay triangulations. In summary, we observe that tree-based or mesh-based overlays improve the mapping of the logical overlay network to the network topology, if compared with Delaunay triangulations and hypercubes. On the other hand, considering that the presented Delaunay triangulations merely account for the geographical position of a node, but do not perform delay measurements between nodes in the overlay network, the results for Delaunay triangulations are encouraging.



#### IV. THE DT PROTOCOL

In this section, we describe a network protocol which establishes and maintains a set of applications in a logical Delaunay triangulation. The protocol, referred to as DT protocol, has been implemented and tested as part of the HyperCast overlay software [11].<sup>2</sup> The network protocol implements a distributed incremental algorithm for building a Delaunay triangulation.

In the following sections, we will refer to the protocol entities that execute the DT protocol as *nodes*. Each node has a logical address and a physical address. The logical address of a node is represented by (x, y) coordinates in a plane, which identify the position of a vertex in a Delaunay triangulation. The length of x and y coordinates are represented by numbers set to 32 bits each. The logical address of a node is a configuration parameter, and can be assigned to a node, or derived from the geographical location or the IP address of a node. The physical address of a node is a globally unique identifier on the Internet, consisting of an IP address and a UDP port number.

We will denote the coordinates of a node A as  $coord(A) = (x_A, y_A)$ . We define an ordering of nodes where coord(A) < coord(B), if  $y_A < y_A$ , or  $y_A = y_B$  and  $x_A < x_B$ .

## A. Neighbors and Neighbor Test

We say two nodes are neighbors if the edge connecting the two nodes appears in the Delaunay triangulation graph. Each node maintains a *neighborhood table* which contains its neighbors in the Delaunay triangulation overlay.

The protocol operations at a node mainly consists of adding and removing neighbors to and from its neighborhood table. To add or remove a node to or from its neighborhood table, a node needs to know if that node is eligible to be its neighbor in the overlay network topology. We next describe the *neighbor test* algorithm we developed for this purpose. The neighbor test is based on the *locally equiangular* property described in Section II-C.

Before describing this algorithm, we first introduce the notions of clockwise (CW) and counterclockwise (CCW) neighbors of a given node, say node A, with respect to another node, say node B. A neighbor of node A is said to be the CW (or CCW) neighbor with respect to node B, if 1) it forms the smallest clockwise or counterclockwise angle to node Bwith node A as the pivot and 2) the smallest clockwise or counterclockwise angle is less than 180°. The notions of CW and CCW neighbors are illustrated in Fig. 8, where we show the CW and CCW neighbors of node M with respect to node A. In Fig. 8(a), node B is the CW neighbor of M with respect to A, and is denoted as  $B = CW_A(M)$ . On the other hand, in Fig. 8(b), node B is not regarded as the CW neighbor since the clockwise angle is larger than 180°. In this case, we say node M has no CW neighbor with respect to node A. In both Fig. 8(a) and (b), node D is the counterclockwise neighbor of M with respect to A, and is denoted as  $D = CCW_A(M)$ .

We now describe the *neighbor test*. In the neighbor test, a testing node determines if another (the tested) node should



Fig. 8. CW and CCW neighbors of M with respect to A are M's neighbors that form the smallest CW and CCW angles to A, taking M as the pivot. (a)  $B = CW_A(M)$  and  $D = CCW_A(M)$ . CW angle <180°. (b) Node B is not the CW neighbor since the clockwise angle is greater an 180°. CW angle  $\geq 180^\circ$ .

or should not be its neighbor. The testing node performs the neighbor test by looking at the coordinates of its current neighbors and the tested node. The test covers all possible locations of the tested node, relative to the testing node and the neighbors of the testing node.<sup>3</sup>

In the following description, M denotes the testing node and A denotes the tested node. Essentially, the neighbor test verifies the *locally equiangular* property for convex quadrilaterals from Section II-C. That is, if M has CW and CCW neighbors with respect to A,  $CW_A(M)$  and  $CCW_A(M)$ , and the quadrilateral formed by M,  $CCW_A(M)$ , A, and  $CW_A(M)$  is convex, A passes the neighbor test at M, if the edge  $\overline{MA}$  maximizes the minimum internal angle. Otherwise, A does not pass the neighbor test at M.

However, there are several cases to consider where the above test cannot be made. In these cases, A passes the neighbor test at M, if adding A results in a triangulation. The following is a complete set of all feasible cases.

- If M has a neighbor D, such that M, A and D lie on the same line, A passes the neighbor test, if A is closer to M than D. This is illustrated in Fig. 9(a).
- If M does not have a CW or a CCW neighbor with respect to A, A passes the neighbor test. This is illustrated in Fig. 9(b). Note that this includes the case where M has neither a CW nor a CCW neighbor with respect to A.
- 3) If the quadrilateral formed by M,  $CCW_A(M)$ , A, and  $CW_A(M)$  is a triangle [see Fig. 9(c)] or is concave [see Fig. 9(d)], A passes the neighbor test at M.

As described, A fails the neighbor test at M only in two cases: 1) M has a neighbor, say node D, and M, A, and D are on a line, and D is closer to M than A and 2) the *locally equiangular* property is violated in the convex quadrilateral formed by M,  $CCW_A(M)$ , A, and  $CW_A(M)$ . For all other cases, A passes the neighbor test at M.

<sup>&</sup>lt;sup>2</sup>In addition to building overlay networks, the HyperCast software provides a socket-style API for transmitting data in an overlay network and tools that collect data from the nodes of an overlay network.

<sup>&</sup>lt;sup>3</sup>For conciseness, we use "node" and "coordinates of a node" interchangeably.



Fig. 9. Neighbor test at the testing node M for a tested node A, for cases where the *locally equiangular* property is not applicable, since it is not feasible to form a convex quadrilateral of nodes M, A,  $CW_A(M)$ ,  $CCW_A(M)$ . The depicted scenarios show cases when A is added as a neighbor of M. Solid lines show M's current neighbors, and dashed lines are used to indicate the quadrilateral. (a) M has a neighbor D, and M, A, and D are on the same line. (b) M has no CW or CCW neighbor with respect to A. (c) Quadrilateral degenerates to a triangle. (d) Quadrilateral is concave.

We can argue the correctness of the neighbor test as follows. The neighbor test is a consequence of the *locally equiangular* property from [30], which states that a triangulation where all convex quadrilaterals are locally equiangular, is a Delaunay triangulation. The neighbor test enforces the property from [30] by enforcing two points: 1) whenever a convex quadrilateral is formed by the nodes M,  $CCW_A(M)$ , A and  $CW_A(M)$ , then the locally equiangular property is enforced and 2) when no convex quadrilateral can be formed by nodes M,  $CCW_A(M)$ , A, and  $CW_A(M)$ , i.e., the locally equiangular property is not applicable, then node A passes the neighbor test at M if adding A as a neighbor forms a triangulation.

Each node periodically sends *neighbor messages* to nodes in its neighborhood table. A neighbor message contains the physical and logical addresses of the sending node, as well as the logical and physical addresses of its CW and CCW neighbors with respect to the receiver.

Each entry of the neighborhood table at a node has columns for the neighbor, the CW neighbor, and the CCW neighbor. For example, the neighborhood entry at node M for one of its neighbors A has the following form:

Neighborhood table at node M:				
	CW	CCW		
Neighbor	neighbor	neighbor		
A	$E = CW_M(A)$	$F = CCW_M(A)$		
• • •	•••	•••		

Now, when a node M receives a neighbor message from node A, it first checks if node A is in its neighborhood table. If node A is, then it updates the entry of node A in the neighborhood table, changing the CW and CCW neighbor fields of the entry if they are different from the CW and CCW neighbor fields contained in the neighbor message. If node A is not a neighbor of M, then M runs a *neighbor test* for A. If A passes the neighbor test, it will be added as a new neighbor in the neighborhood table of M.

We say a node is a *candidate neighbor* of another node, if it is not in the neighborhood table of that node and it passes the neighbor test at that node. The formal definition of the *candidate*  *neighbor* will be given in Section IV-F. A node can learn about a candidate neighbor only in two ways: 1) through NewNode messages described in Section IV-D and 2) from the CW or CCW neighbor fields in the neighborhood table. If a node has candidate neighbors, it will send a neighbor message to the closest candidate neighbor. If the candidate neighbor responds with a neighbor message, the candidate neighbor is elevated to the status of a neighbor, i.e., a new entry is created in the neighborhood table.

A neighbor can be removed from the neighborhood table for any one of the following reasons: 1) the neighbor has sent a message indicating it has left the overlay; 2) no message has been received from this neighbor for an extended period of time; or 3) the neighbor has failed a neighbor test.

We say that a node A is *stable*, if all nodes that appear in the CW or CCW neighbor columns of A's neighborhood table also appear in the neighbor column of A's neighborhood table. Otherwise, a node is *not stable*. If the overlay is not partitioned and all nodes are stable, then the set of nodes has established a logical Delaunay triangulation.

#### B. Rendezvous Mechanisms With DT Servers and Leaders

Any protocol that builds an overlay network must provide a rendezvous mechanism that enables nodes which are not members of the overlay to communicate with nodes in the overlay. The rendezvous mechanism is also used when new nodes join an overlay and when the overlay network has been partitioned and must be repaired.<sup>4</sup>

One can think of three methods that can accomplish a rendezvous between members and nonmembers of an overlay network: 1) nonmembers have available a broadcast mechanism to announce themselves to members of the overlay network; 2) nonmembers maintain a list of "likely" members of the overlay network (a "buddy list") and contact members from this list; and 3) nonmembers contact a well-known server to learn about members of the overlay network.

<sup>&</sup>lt;sup>4</sup>We say an overlay network is partitioned if the graph represented by the overlay has multiple connected components. In a partitioned overlay, some nodes cannot communicate with each other across the overlay.

In the DT protocol, we select the third method, i.e., members join the overlay and partitioned overlay networks are repaired with the help of a server. A reservation against using a well-known server is that the server may become a performance bottleneck, and that it constitutes a single point of failure. To address the performance concern, in our experiments, a single server was sufficient to manage the workload from 10 000 new members joining the overlay in a short period of time. The single point of failure can be avoided by adapting the DT protocol so that it supports multiple servers. Also, we emphasize that the effort to create variations of the DT protocol which use broadcast announcements or buddy lists is rather small, and that these variations can preserve the main characteristics of the DT protocol.

The server component of the DT protocol is called *DT server*. New nodes join the overlay network by sending a request to the DT server. The server responds with the logical and physical addresses of some node that is already in the overlay network. The new node then sends a message to the node identified by the DT server and, thus, establishes communication with some node in the overlay network.

The DT server is also engaged in repairing partitions of the overlay network as follows. In the DT protocol, a node assumes that it is a *Leader* if it does not have a neighbor with a greater logical address (using the ordering given at the beginning of this section). Each leader periodically sends messages to the DT server. The DT server tries to respond to such a message with the coordinates of a node that is larger than that of a leader. Hence, if an overlay has a partition and more than one node believes to be a leader, all but one of these nodes receives node coordinates. By virtue of the Delaunay triangulation, if a node A that believes to be a leader, learns about a node B and coord(A) < coord(B), then B will pass A's neighbor test, and, consequently, A adds node B as a candidate neighbor. Also, A no longer believes to be a leader. Thus, the partition of the overlay network is repaired.

The DT server maintains a list ("cache") of logical and physical addresses of other nodes in the overlay. When the DT server sends the address of a node in the overlay to a newly joining node, this address is taken from the cache. We set the default size of the cache to 100 nodes. If a newly joining node contacts the DT server and the cache is not full, this node will be added to the cache. The DT server periodically queries nodes in the cache to verify that these nodes are still members of the overlay. If a node does not respond to a query it will eventually be removed from the cache. Also, a node, with the exception of the nodes in the cache with the highest coordinates, is removed from the cache after the DT server has selected this node six times as the "contact node" for a newly joining node.

## C. Timers

The DT protocol is a soft-state protocol, that is, all remote state information is periodically refreshed, and is invalidated if it is not refreshed. The operations to recalculate and refresh state are triggered with the help of timers. A node of the DT protocol uses the following three timers.

*Heartbeat Timer:* The heartbeat timer determines when a node sends neighbor messages to its neighbors. The timer runs

in two modes, *SlowHeartbeat* and *FastHeartbeat*. A node is in FastHeartbeat mode when it joins the overlay and when it has candidate neighbors. Otherwise, it is in SlowHeartbeat mode. The operation of the heartbeat timer in two modes trades off the need for fast convergence of the overlay network when the topology changes, and low bandwidth consumption in a steady state. In our experiments, we set the timeout value of the heartbeat timer to  $t_{\text{SlowHeartbeat}} = 2 \text{ s}$  in SlowHeartbeat mode. The DT server also has a Heartbeat Timer with a timeout value of  $t_{\text{SlowHeartbeat}} = 2 \text{ s}$ . Each time the timer expires, the DT server sends a CachePing message to each node in the node cache.

*Neighbor Timer:* If a node has not received a neighbor message from one of its neighbors for  $t_{\text{Neighbor}}$  s, the neighbor will be deleted from the neighborhood table. There is one Neighbor Timer for each neighbor in the neighborhood table. The default timeout value of the neighbor timer is set to  $t_{\text{Neighbor}} = 10$  s.

*Backoff Timer:* When a node does not receive a reply from the DT server, it retransmits its request using an exponential back-off algorithm with a Backoff timer. Initially, the timeout value of Backoff timer is set to  $t_{\text{Backoff}} = t_{\text{FastHeartbeat}}$  and doubled after each repeated transmission, until it reaches  $t_{\text{Backoff}} = t_{\text{Neighbor}}$  (=10 s). If there are alternate DT servers, the node switches to an alternate DT server when  $t_{\text{Backoff}} \ge t_{\text{Neighbor}}$  seconds.

In addition to the abovementioned Heartbeat timer, the DT server keeps the following two timers.

*Cache Timer:* If the DT server has not received a CachePong message from a node in its node cache, in response to CachePing message for  $t_{\text{Cache}}$  s, the node will be deleted from the cache. The default timeout value of the timer is  $t_{\text{Cache}} = 10$  s.

*Leader Timer:* If the DT server has not received a message from the Leader for  $t_{\text{Leader}}$  seconds, another node from the node cache will be selected as Leader. The default timeout value of the leader timer is  $t_{\text{Leader}} = 10$  s.

#### D. Message Types

The DT protocol has eight types of messages, which are sent as UDP datagrams. All messages of the DT protocol are unicast messages. We describe the contents of each message and the operations associated with the transmission and reception of each message. We refer to [20] for the precise message format.

HelloNeighbor and HelloNotNeighbor Messages: These messages are used to create and refresh neighborhood tables at nodes. Each HelloNeighbor<sup>5</sup> and HelloNotNeighbor message contains the logical and physical addresses of the sender. The receiver of a HelloNeighbor or HelloNotNeighbor message needs to know the physical address of the sending node, and the clockwise and counterclockwise neighbors of the sender with respect to the receiver. Each time the Heartbeat timer goes off, a node sends a HelloNeighbor messages to each of its neighbors, and to one of its candidate neighbors, if there is a candidate neighbor. If there are multiple candidate neighbors, the message is sent to the candidate neighbor with the "closest" coordinates.

<sup>5</sup>Earlier, we referred to HelloNeighbor messages as neighbor messages.

A HelloNotNeighbor message is sent as an immediate reply to the reception of a HelloNeighbor message from a node that fails the neighbor test. The HelloNotNeighbor message serves three purposes. First, the information in the message is used by the receiver to update its neighborhood table. Second, the clockwise and counterclockwise neighbors in the HelloNotNeighbor message provide the receiver with additional information about neighbors in its vicinity. Lastly, HelloNotNeighbor messages are used to resolve situations where two nodes have the same logical address.

A special case exists, when two or more nodes have the same logical address. When a node A learns about the existence of a node B with coord(A) = coord(B), through any method except a HelloNeighbor message from B, then A sends a HelloNeighbor message to B. When a node B receives a HelloNeighbor message from a node A, and coord(B) = coord(A), then B changes its logical address. When a node A has a node B in its neighborhood table, and A learns about a node C, with coord(B) = coord(C), then A sends a HelloNotNeighbor message to C. This is discussed in more detail in Section IV-E.

*Goodbye Message:* When a node leaves the overlay, it sends Goodbye messages to the DT server and all its neighbors. If a node receives a Goodbye message, it removes the sender of the Goodbye message from the neighborhood table. The DT server removes the sender of a Goodbye message from its cache. A node that has sent Goodbye messages, can continue to send Goodbye messages in response to each message received, until the process that runs the node is terminated by the application.

ServerRequest and ServerReply Messages: ServerRequest and ServerReply messages, respectively, are queries to and replies from the DT server. ServerRequest messages are sent by newly joining nodes and Leaders. A Leader sends a Server-Request message every  $t_{\text{FastHeartbeat}}$  seconds. ServerRequest messages are retransmitted if no Server Reply is received, using the exponential backoff outlined above.

Each ServerRequest message contains the logical and physical addresses of the sender. The same argument holds for the sender of a ServerRequest message. The physical address of the sender should be recovered by the receiver of the message. The ServerReply message contains the logical and physical addresses of some node in the overlay. More specifically, a ServerReply sent to node X contains the logical and physical addresses of some node Y, with  $coord(X) \leq coord(Y)$ . Newly joining nodes use addresses in the ServerReply message to find a node that is already in the overlay. Leaders use the addresses in the ServerReply message to determine if the overlay has a partition.

NewMode Message: The NewNode message contains the logical and physical addresses of a new node. When a new node N obtains from the DT server the address of some node in the overlay, say D, then N will send a NewNode message to D. If N passes the neighbor test at D, then N becomes a candidate neighbor at D, and D responds to N with a HelloNeighbor message. Otherwise, D passes the NewNode message to one its neighbors whose coordinates are closer to those of N. In such a way, the NewNode message is routed through the overlay toward the coordinates of the new node, until the NewNode

message reaches a node where the new node passes a neighbor test.

CachePing and CachePong Messages: CachePing and CachePong messages are used to refresh the contents of the cache at the DT server. Every  $t_{\text{SlowHeartbeat}}$  seconds, the DT server sends a CachePing message to every node in the cache. A node that receives a CachePing message immediately replies with a CachePong message.

## E. Shifting Coordinates

Since the logical address of a node is a configuration parameter, it may happen that two nodes have the same coordinates, or that the coordinates of four nodes lie on a circle. In the former case, the Delaunay triangulation is not defined, and in the latter case, the Delaunay triangulation overlay is not unique. In both cases, the DT protocol forces one of the nodes to change its coordinates by a small amount, thus, ensuring that the Delaunay triangulation of the nodes is unique.

Whenever a node receives a message from a node with the same coordinates, the receiver shifts its coordinates by a small amount, and removes all neighbors that fail the neighbor test with the new coordinates. If a node A receives a message from a node B, and a node in A's neighborhood table has the same coordinates as node B, then node A sends a HelloNotNeighbor message to B. Since the HelloNotNeighbor message contains A's neighbor with B's logical address, B sends the node with the duplicate logical address a HelloNeighbor message. The receiver of this HelloNeighbor message notices that the message was sent by a node with the same coordinates, and changes its logical address.

If a node A receives a HelloNeighbor or HelloNotNeighbor message from a node N such that the sender N, the receiver A, the CW and CCW neighbors of A with respect to N,  $CW_N(A)$ and  $CCW_N(A)$ , lie on a circle, A will shift its coordinates before processing the message.

Each time a node receives a HelloNeighbor or HelloNot-Neighbor message from a neighbor, it checks if the neighbor's logical address has changed. If the logical address has changed, the node removes the neighbor's entry from the neighborhood table and then processes the message. In most cases, the node with the shifted coordinates will be added again as a neighbor.

#### F. States and State Transitions of the DT Protocol

We next discuss the states and state transitions of the DT protocol. The discussion summarizes our earlier description of the protocol. The DT protocol has two different finite state machines, one for a node and one for the DT server. A detailed description of the state transitions in tabular form is given in [20].

1) Node States: The state of a node is derived from the neighborhood table. There are no variables that memorize the states of a node.

A node is in one of five states: *Stopped, Leader without Neighbor, Leader with Neighbor, Not Leader,* and *Leaving.* Recall that a node is a Leader if the node has no neighbor with greater coordinates than its own. By definition, a node with no neighbors is a leader. The states *Leader with Neighbor* and *Leader without Neighbor* are distinguished, for the following reason. When a newly joining node starts up or when a node

TABLE I NODE STATE DEFINITIONS

State Name	State Definition
Stopped	The node is not running
Leaving	The node is going to leave the
	group
Leader with-	The node that has no neigh-
out Neighbor	bors
Leader With	The node that has neighbors,
Neighbor	and no neighbor has greater
	coordinates than its own
Not Leader	The node has a neighbor with
	coordinates greater than its
	own

TABLE II NODE SUBSTATE DEFINITIONS

Sub-state Name	State Definition
Stable With-	The node is stable and has no
out Candidate	candidate neighbors
Neighbor	
Stable With	The node is stable and has
Candidate	candidate neighbors
Neighbor	
Not Stable	The node is not stable

has no neighbors, it believes itself to be a leader, and it will generate NewNode Messages when it learns about a node in the overlay to contact. A node with neighbors does not send NewNode Messages.

The definitions of the five states are given in Table I.

For nodes in states *Leader with Neighbor* and *Not Leader*, we define three substates: *Stable With Candidate Neighbor*, *Stable Without Candidate Neighbor*, and *Not Stable*. We say a node X is stable when all nodes that appear in the CW and CCW neighbor columns of node X's neighborhood also appear in the neighbor column; otherwise node X is not stable. We say a node M has a candidate neighbor, say node N, if 1) N appears in the CW or CCW column of M's neighborhood table, or if N is contained in a NewNode message received by M; 2) N is not in the neighbor column of M's neighborhood table; and 3) N passes the neighbor test at M. The definitions of the three substates are given in Table II.

A new node starts in state *Stopped*. When it is in state *Leader With Neighbor* and *Not Leader*, the node also has a substate. The transition diagram of states and substates is shown in Fig. 10.

2) DT Server States: The functions performed by the DT server are minimal. It is used as rendezvous point when new nodes join the overlay network and when the overlay Newark must be repaired after a partition. The DT server has only two states: *Has Leader* and *Without Leader*. Recall that the DT server maintains a cache of nodes. The node with the highest logical address is identified by the DT server as the Leader of the overlay network. If the node cache is empty, the DT server has no information about nodes in the overlay network. This state is referred to as *Without Leader*. If the node cache is not empty, the DT server can identify the Leader of the overlay network. This state is referred to as *Has Leader*. The definitions of the two states are given in Table III.



Fig. 10. State transition diagrams for nodes. States are indicated as circles. State transitions are indicated as arcs. Each arc is labeled with the condition that triggers the transition. (a) Transition diagram of node states. (b) Transition diagram for substates.

TABLE III	
DT SERVER STATE DEFINITION	S



Fig. 11. DT server state transition diagram.

The state transition diagram of the DT server is shown in Fig. 11. The DT server starts in state *Without Leader*. When the first joining node sends a ServerRequest message to the DT server, this node is added to the node cache, and the DT server will enter state *Has Leader*.

## G. Examples

In an overlay network, without any changes for an extended period of time, there are three types of events: 1) all



Fig. 12. Node N with coordinates coord(N) = (8, 4) joins the overlay network. Note that in (a) and (b), we have omitted some edges from the Delaunay triangulation for the sake of simplicity, and in (c)–(f), we have omitted nodes X and Y.

nodes send HelloNeighbor messages to their neighbors every  $t_{\text{SlowHeartbeat}}$  seconds; 2) the Leader exchanges ServerRequest and ServerReply messages with the DT server every  $t_{\text{FastHeartbeat}}$  seconds; and 3) the server exchanges CachePing and CachePong messages with the nodes in its cache every  $t_{\text{SlowHeartbeat}}$  seconds.

In the following, we illustrate the dynamics of the DT protocol, when a node joins and leaves the Delaunay triangulation.

1) Node Joins: In Fig. 12, we illustrate the steps of the DT protocol when a new node, N, with coord(N) = (8, 4), joins an overlay network. As shown in Fig. 12(a), N first sends a Server-Request to the DT server, and receives a ServerReply, which contains the logical and physical addresses of some node X with coord(X) > coord(N). Then, node N sends a NewNode message to X [Fig. 12(b)]. X performs a neighbor test for N,

which fails. Therefore, X forwards the NewNode message to neighbor Y, which is closer to N than X. Assuming that N fails the neighbor test at Y, node Y forwards the NewNode message to D which is closer to N than Y. At node D, N passes the neighbor test and, therefore, D makes N a candidate neighbor and sends a HelloNeighbor message to N.<sup>6</sup> Now, N has found its first neighbor.

Since the HelloNeighbor from D in Fig. 12(b) contains  $B = CW_N(D)$  and  $C = CCW_N(D)$ , nodes B and C become candidate neighbors at N. At the next timeout of the Heartbeat timer, N sends a HelloNeighbor message to its'neighbor D, and its closest candidate neighbor B [Fig. 12(c)]. As soon as these HelloNeighbor messages are received at B and D, these nodes will

<sup>6</sup>Since the NewNode message contains the physical address of node N, any node that receives the NewNode message can send messages to N.



Fig. 13. Node N with coordinates coord(N) = (8, 4) leaves the overlay network.

drop each other from their neighborhood table. In other words, the link in the overlay between nodes B and D is removed.

In Fig. 12(d), we assume that the Heartbeat timers expire at both B and D. (Note that the sequence of events in this example is different if the Heartbeat timers expire in a different order.) Both nodes send HelloNeighbor messages to their neighbors. When N receives the message from B, it promotes B from a candidate neighbor to a neighbor. The messages from B to E and, from D to C, contain N as CW or CCW neighbor. Hence, N becomes a candidate neighbor at C and E.

Assuming that the next Heartbeat timeout occurs at nodes C and E, these nodes send HelloNeighbor messages to all their neighbors and their candidate neighbor N [Fig. 12(e)]. When N receives the messages from C and E, it adds these nodes as neighbors. Now, N has a correct view of its neighborhood.

At the next Heartbeat timeout at N, shown in Fig. 12(f), N sends HelloNeighbor messages to nodes B, C, D, and E. When the respective HelloNeighbor messages arrive at C and E, these nodes promote node N from candidate neighbor to neighbor. This completes the procedure for joining node N to the overlay network. Subsequently, each node sends HelloNeighbor messages to its neighbors at each Heartbeat timeout.

2) Node Leaves: In Fig. 13, we illustrate the steps involved when node N leaves the overlay network. When N decides to leave the overlay, it sends Goodbye messages to all its neighbors and the DT server [Fig. 13(a)]. When the server receives the Goodbye message, it removes N from the cache. When the neighbors receive the Goodbye message, they remove N from the neighborhood table.

However, even though N is deleted as neighbor at nodes B, C, D, and E, these nodes have some other neighbor entries, where N is listed as CW or CCW neighbor. For example, since  $N = CW_E(B)$  and  $N = CCW_E(D)$ , node N appears as CW neighbor of B and as CCW neighbor of D in E's neighborhood table. By definition of a candidate neighbor, N is now a candidate neighbor at B, C, D, and E, and the nodes will send HelloNeighbor messages to N at their next Heartbeat timeout.<sup>7</sup>

Let us now assume that all nodes send HelloNeighbor message to their neighbors, and their candidate neighbor N [Fig. 13(b)]. When N receives the messages, it responds with Goodbye messages, as shown in Fig. 13(c).

The HelloNeighbor messages sent in Fig. 13(b) contain the updated values of the CW and the CCW neighbors of the nodes. For instance, B's message to E lists C (and no longer N) as the CW neighbor of B with respect to E, that is,  $C = CW_E(B)$ . As a result, after Fig. 13(b), node N no longer exists as a CW or CCW neighbor in the neighborhood tables of any node. Further, nodes B, C, D, and E, know about each other either as neighbors, or as CW or CCW neighbor tests are executed, C fails the neighbor tests at node E, and vice versa. On the other hand, D passes the neighbor test at node B, and B passes the test at node D. Hence, nodes B and D add each other as candidate neighbors and send HelloNeighbor messages to each other [Fig. 13(d)]. Once these messages are received, both B and D

 $<sup>^7\</sup>mathrm{These}$  HelloNeighbor messages to N are superfluous. However, avoiding these messages adds a requirement that nodes remember recently received Goodbye messages.



Fig. 14. Network topology of the Centurion cluster. The figure only shows equipment involved in the experiments. Switches 3 to 11 are Ethernet switches with 100 Mb/s ports and one 1-Gb/s uplink. All links are full duplex. Hosts are labeled "centurionN," where N is a number. All hosts have valid IP addresses and may run other applications at the time of the experiments. At most 100 nodes are involved in any single experiment.

have established each other as neighbors, and, as a result, the overlay network is repaired.

## V. EVALUATION OF THE DT PROTOCOL

We have evaluated the performance characteristics of the DT protocol in measurement experiments on a cluster of Linux PCs. The experiments include up to 100 PCs and overlay networks with up to 10 000 nodes.

The DT protocol was implemented in Java using Sun's Java Virtual Machine 1.3.0, which includes the HotSpot just-in-time compiler. Details of the implementation can be obtained from [11].

The measurement experiments were conducted on the Centurion computer cluster at the University of Virginia. The experiments use up to 100 PCs from the cluster, each equipped with two 400-MHz Pentium II processors and 256-MB RAM. The server of the DT protocol was run on a 933-MHz Pentium III with 1-GB RAM. All machines run the Linux 2.2.14 operating system. The network of the Centurion cluster is a switched Ethernet network with a two-level hierarchy, as shown in Fig. 14. Each PC is connected to a 100 Mb/s port of an Ethernet switch. Each Ethernet switch has a 1-Gb/s uplink to a Gigabit Ethernet switch. All machines of the Centurion cluster have valid IP addresses and are on the same IP subnetwork. Hosts used in the experiments were not available for exclusive use, and may have run other applications.

In the experiments, each PC (henceforth referred to as "host") executes between one and 100 nodes of the overlay networks, allowing overlay networks with up to 10 000 nodes. The number of nodes in an experiment are evenly distributed over the 100 hosts of the PC cluster. For instance, in an experiment with 1000 nodes, ten nodes are assigned to each host. In all experiments, the coordinates of a node in the Delaunay triangulation are assigned as a randomly selected point from a 10 000 by 10 000 grid. Results obtained with this random assignment of coordinates can be interpreted as lower bounds for the expected performance of any more sophisticated assignment method that considers the topology of the underlying network.

#### A. Evaluation of the Overlay Graphs

We first evaluate the properties of the overlay graphs generated by the DT protocol for the network topology in Fig. 14. We have constructed overlay networks with 100 to 10 000 nodes. Recall that the coordinates of nodes are randomly assigned, and, hence, the DT protocol does not consider the network topology when constructing an overlay network.

We evaluate the *outdegree*, defined as the number of neighbors of a node, the *path length*, defined as the number of logical overlay edges between a given pair of nodes, and the *stress*, where the stress of a network link l with respect to a multicast sender is the number of overlay edges in the embedded spanning tree (with the multicast sender as root of the tree) that pass over link l. Since the outdegree of a node provides an upper bound for the number of times that any particular message is forwarded at a node, the outdegree is a measure for the processing load at a node in the overlay. The path length is an indicator for the delay in the overlay network. The stress indicates how efficient the overlay utilizes the available network bandwidth.

The results are shown in Fig. 15. Each data point in the plots contains the results from five generated overlay networks. Fig. 15(a) shows the outdegree of nodes when the number of nodes in the overlay network is increased. The average outdegree is approximately six, as is expected for any triangulation graph. Although the worst case outdegree of a node in a Delaunay triangulation is N - 1, where N is the number of nodes, the maximum outdegree is generally small [13].

Fig. 15(b) shows the path length in the overlay network between randomly selected pairs of nodes as a function of the number of nodes in the overlay topology. Each data point in the graph shows the values from five topologies, where in each topology, we evaluate 1000 randomly selected pairs of nodes. (The random selection of paths is justified by the considerable effort to compute all paths.) The average number of hops closely matches  $\sqrt{N/4}$ , where N is the number of nodes.

Fig. 15(c) shows the stress values for the links of the network in Fig. 14. (We ignore logical links between nodes that run on the same host.) With the random assignment of logical addresses to nodes of the overlay, the links at the Gigabit switch are



Fig. 15. (a) Outdegree of nodes, path length between two nodes, and stress of links in the overlay network. Each data point shows the results from five generated graphs. (b) Values for the path length are computed from 1000 randomly selected node pairs. (c) Values for the "stress" of a link are computed for at most 1000 randomly selected multicast trees.

expected to have higher stress values than the 100-Mb/s links. Thus, we plot the stress in Fig. 15(c) separately for 100-Mb/s links and 1-Gb/s links. Each data point contains the results from five overlay topologies generated for the network in Fig. 14. Since the values for stress at a link depend on the selection of the multicast routing tree, we calculate the stress for the multicast routing trees of 1000 randomly selected senders (if the number of nodes is less than 1000, we consider all senders). The results in Fig. 15(c) show that the stress for 10000 nodes can exceed 100 at a 100-Mb/s link, and can exceed 1000 at a 1-Gb/s link. In comparison to Section III, the stress values are significantly worse. This is due to the random assignment of (x, y) coordinates, and the star-shaped topology of the network in Fig. 14. Note that the small difference between the average stress and the 99th percentile of the stress indicate that the stress is high for all multicast trees.

#### B. Performance of the DT Protocol

We now evaluate the performance of the DT protocol by measuring the time required to form a Delaunay triangulation overlay network, and to repair the Delaunay triangulation after nodes depart. Later, we examine the steady state bandwidth requirements of the protocol at the nodes and at the DT server.

To measure the time to build an overlay network, we set up an initial Delaunay triangulation overlay network with N nodes, and add M new nodes at the beginning of the experiment. The rate at which new nodes are generated is limited by the computational power and number of the hosts. In our experiments, each hosts spawns off new nodes as fast as possible. Then we measure the time delay until the overlay network of N + M nodes has formed a Delaunay triangulation. The *Time-to-Stabilize* is measured from the time the first new node joins the overlay until the overlay network has become stable after the last node has been added. In all experiments, nodes are evenly distributed over 100 hosts of the PC cluster.

The measurements of delays and bandwidth requirements heavily depend on the selection of the timer values of the protocols. In all our experiments, we use the values given in Section IV-C.

Fig. 16(a) shows the Time-to-Stabilize for experiments with N = 0, 1000, 2000, 5000, 7500 and M = 50 to 10 000 nodes. We consider overlay networks with up to 10 000 nodes, that is,  $M + N \leq 10 000$ . Each data point shows the average of five repetitions of the same experiment. Since the coordinates are randomly assigned, each repetition of an experiment is likely to result in a different overlay topology. Fig. 16(a) contains five curves, one plot for each value of N. Each curve shows the Time-to-Stabilize, measured in seconds, as a function of M+N, i.e., the final number of nodes. The figure shows that a Delaunay triangulation with 10 000 nodes is formed in less than 35 s.

Fig. 16(b) shows the time to stabilize when nodes leave the overlay network. We assume that there is an overlay network with N nodes, where  $N = 1000, 2000, 5000, 10\,000$ . At the beginning of each experiment, M nodes depart from the overlay network. We measure the time until the resulting overlay network of N-M stabilizes to a Delaunay triangulation. Each data point presents an average of five repetitions of an experiment. As before, we present one curve for each value of N, and depict the Time-to-Stabilize as a function of N-M. The results show that the Delaunay triangulation is quickly repaired even when a large number of nodes depart. When almost all nodes leave the



Fig. 16. Time-to-stabilize when nodes join or leave the overlay network. (a) M new nodes are added to an overlay of N nodes. The time to stabilize is the time until the resulting overlay network of N + M nodes has formed a Delaunay triangulation. (b) There are N nodes initially, and M nodes depart at the beginning of the experiment. Here, the time to stabilize is the time until the resulting overlay network of N - M nodes has formed a Delaunay triangulation.



Fig. 17. Bandwidth requirements of nodes and the DT server in an experiment where M nodes are added to an initially empty overlay network. Measurements are taken for intervals of the length of the Heartbeat timer until the Delaunay triangulation is completed. (a) Peak bandwidth of nodes is presented as average, 99th percentile, and maximum over all nodes. (b) Average and peak bandwidth requirements at the DT server are presented.

overlay network, that is, when N - M is small, the overlay network stabilizes on the average in less than 10 s for all considered values of N.

We also measured the peak bandwidth requirements when nodes are added to an overlay network, by counting the maximum number of sent and received messages between any two expirations of the Heartbeat timer at nodes and the DT server. Recall that Heartbeat timers are set to either  $t_{\rm FastHeartbeat}$  or  $t_{\rm SlowHeartbeat}$  seconds. We present the data in terms of bits per second, but we only account for the payload size of messages and do not account for the UDP header, IP header, or Ethernet headers. Since messages are at most 61-bytes long, the bandwidth requirements at the data link layer are up to 75% higher than shown in the graphs.

Fig. 17 shows the bandwidth requirements of nodes in an experiment which builds a Delaunay triangulation with M nodes, starting with an overlay network with N = 0 nodes. The figure depicts the bandwidth requirements as a function of M. The measurements are taken over the entire length of the experiment, that is, until the Delaunay triangulation of M nodes is completed. Fig. 17(a) illustrates that the peak bandwidth, averaged over all nodes, is below 38 kb/s for all values of M. The 99th percentile of the peak bandwidth at nodes is below 70 kb/s. However, the node with the highest peak bandwidth, was measured at 485 kb/s, corresponding to 249 messages in a time period of  $t_{\text{FastHeartbeat}} = 0.25$  s.

Fig. 17(b) shows the peak and average bandwidth requirements at the DT server during the same experiment. The average

bandwidth requirements at the DT server are below 400 kb/s, even when 10 000 nodes want to join the overlay network. The peak bandwidth requirement at the DT server is about 1300 kb/s. Since each node that joins the overlay network sends a message to the DT server, the bandwidth requirements at the DT server should increase with M. The fact that the peak bandwidth does not increase for  $M \ge 2000$  nodes indicates that the rate at which new nodes are generated is limited by the rate at which the hosts can start new overlay nodes.

## C. Bandwidth Requirements of DT Protocol in Steady State

We have performed measurements of the bandwidth requirements by the DT protocol in a steady state, that is, when no nodes are added or removed from the Delaunay triangulation overlay. We use an overlay network with 10 000 nodes and measure the number of messages transmitted by each node. For each overlay network topology, we take measurements over a period of one hour. We repeat each experiment five times. Fig. 18(a) shows a histogram which depicts the distribution of the number of transmitted and received messages for all five repetitions of the experiment. Since, in a steady state, the number of messages at nodes consists mostly of HelloNeighbor messages, the amount of traffic at a node largely depends on the outdegree of the node. To support this observation, we include in Fig. 18(b) a histogram which depicts the distribution of the outdegree of nodes. A comparison of Fig. 18(a) and (b) makes clear that the traffic at a node indeed correlates with the number of neighbors. Recall that in a triangulation graph, each node has on



Fig. 18. Distribution of the number of messages (sent and received) of a node and the number of neighbors per node in an overlay network with 10 000 nodes. The histogram in (a) shows the average number of messages sent and received by a node in a one-second time interval.

the average six neighbors. Thus, with the Heartbeat timer set to  $t_{\text{SlowHeartbeat}} = 2$  s, we expect that each node sends and receives 12 messages over a period of 2 s. With 61 bytes per HelloNeighbor message (not counting UDP, IP, and Ethernet headers), the bandwidth requirements per node are less than 3 kb/s. In all measurements of overlay networks in steady state, no node sent or received more than 23 messages per second, or more than 11.2 kb/s of traffic.

As a final comment, the steady state traffic at the DT server consists mostly of CachePing and CachePong messages to the nodes in the cache. If the cache has a size of 100 nodes, the steady state bandwidth requirement at the DT server is approximately 50 kb/s.

## D. Measurements of Multicast Bulk Transfers

We tested the application-level performance by measuring the throughput and delay of multicasting bulk data in the overlay network. Recall from Section II that a node A in a Delaunay triangulation overlay forward a multicast message from source node S to a neighbor node B, if A is the next hop on the (compass routed) path from B to S. Thus, once the overlay network is established, no routing protocol is needed.

We present measurements from an experiment where multicast data is carried over (unicast) TCP links between neighbors in the overlay. We assume that all data is partitioned into messages with 16-kB payload and 16 bytes of header information.<sup>8</sup> The header information contains, among others, the logical address of the sender of the multicast message.

The measurements of multicast transmissions are performed for overlay networks with N = 2 to 1000 nodes. In the measurement experiments we run one or ten nodes on each host, and the number of hosts involved in an experiment is varied between two and 100. In experiments with one overlay node per host, the multicast sender performs a bulk transfer of 100 MB (=6400 messages). For experiments with 10 nodes per host, the multicast sender performs a bulk transfer of 10 MB of data (=640 messages).

We measure the throughput in multicast trees for ten randomly selected senders, with the exception of N = 2, where we only have two senders. The throughput is measured at all



Fig. 19. Measured multicast throughput at receivers. The plots compare theoretical bounds and measured values of the average throughput of multicast transmissions for a set of multicast trees. We show two measurements: 1) 100-MB bulk data transfers for an overlay with N = 2 to 100 nodes, where at most one node is assigned to each host and 2) 10-MB bulk data transfers for an overlay with N = 20 to 1000 nodes, where always ten nodes are assigned to each host. The error bars show the variation of the measurements across all considered multicast trees.

receivers, as the ratio of the amount of data sent (10 MB or 100 MB) and the time lag between the receipt of the first and last message. As in all previous experiments, we repeat each measurement five times. Fig. 19 shows the average throughput, averaged over all nodes in all multicast trees and all repetitions. To give an indication of the distribution of the throughput values, we include the range of throughput measurements for all multicast trees as error bars. Note that there is a different multicast tree for each generated overlay.

Given a network topology (in our case, Fig. 14), an overlay network, and a multicast sender, the "stress" (see Fig. 6) imposes a limit on the maximum achievable throughout. The achievable throughput can be bounded by  $\min_{l \in L} bw_l/s_l$ , where *L* is the set of all network links in the overlay network which carry traffic from the multicast sender,  $bw_l$  is the capacity of link *l* (here, either 100 Mb/s or 1 Gb/s), and  $s_l$  is the *stress* of link *l*. We calculate these bounds and compare them to the measured values. We include the average value of the bounds, averaged over all multicast trees that were evaluated.

Fig. 19 shows that the throughput for the multicast transmissions is high, achieving an average throughout of close to 15 Mb/s when 100 nodes are running on 100 hosts. The throughput is lower when ten nodes are run on each host. With 1000 nodes running on 100 nodes, the measured throughput is

<sup>&</sup>lt;sup>8</sup>A description of the message format used by the protocol is beyond the scope of this paper and we refer to [11].



Fig. 20. Measured end-to-end delay of messages. The plots show average delays and 99th percentile of delays for receivers in a set of multicast trees. We present two measurements: 1) 100-MB bulk data transfers for an overlay with N = 2 to 100 nodes, where at most one node is assigned to each host; and 2) 10-MB bulk data transfer for an overlay with N = 20 to 1000 nodes, where always ten nodes are assigned to each host.

close to 2 Mb/s. Note that in the experiments which run one node per host, the achieved throughput is close to the theoretical bound. This indicates that the experiment is bandwidth limited in experiments where one overlay node is run on each host. When we run ten overlay nodes on each host, the measured data is lower than the throughput bound. This indicates that the bottleneck is the processing at hosts.

Finally, we present measurements of the end-to-end delay experienced by individual messages during the above multicast experiments. Clocks on the hosts of the Centurion cluster are synchronized using xntpd, which runs the NTP Version 3 protocol [24], and should differ by at most 30 ms. With the synchronized clocks, we can determine the end-to-end delay of a message for a node as the time lag between message transmission and message reception.

Fig. 20 shows the average and 99th percentile values of the end-to-end packet delays for the multicast receivers for 10-MB bulk data transfers (with ten nodes running on a host) and 100-MB bulk data transfers (with one node running on a host). If one node is run on a host, the average delay in a network with 100 nodes is 76 ms and the 99th percentile of the delay is 176 ms. For 100 nodes, using ten nodes per host, the delay is much higher, with an average of 311 msec and a 99th percentile of the delay at 935 ms.

#### VI. CONCLUSION

We have examined Delaunay triangulations as overlay topologies for application-layer multicast. We have presented a protocol, the *DT Protocol*, that creates and maintains a Delaunay triangulation overlay for applications.

The contribution of the presented Delaunay triangulation and the DT protocol is that we can build and maintain very large overlay networks with relatively low overhead, at the cost of poor resource utilization due to a possibly bad match of the overlay network to the network-layer infrastructure. To our knowledge, our study is the first that demonstrates in an implementation that overlay networks with 10 000 members can be built and maintained in a highly distributed fashion and with relatively low overhead.

There are several directions for future work. A limitation of this study is that the experiments with the DT protocol are confined to a local-area environment. We plan to evaluate the DT protocol over a wide-area network. However, managing wide-area measurement experiments for an overlay network with several thousand members imposes significant logistical problems. In addition, since Delaunay triangulations have multiple alternate paths between nodes, an overlay network based on Delaunay triangulations can mask a certain amount of node failures. The geographic routing techniques from [16] may be suitable to find routes to bypass failed nodes. Finally, we have pointed out that the mapping of the Delaunay triangulation overlay network to the network-layer infrastructure can be poor. New coordinate spaces, that can take into consideration network delay measurements [25], may provide an improved mapping of the logical overlay network to the underlying network.

As a final comment, the software of the DT protocol, which is part of the HyperCast software [11], is publicly available.

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