# Network Support for IP Traceback

Stefan Savage, David Wetherall, Member, IEEE, Anna Karlin, and Tom Anderson

*Abstract*—This paper describes a technique for tracing anonymous packet flooding attacks in the Internet back toward their source. This work is motivated by the increased frequency and sophistication of denial-of-service attacks and by the difficulty in tracing packets with incorrect, or "spoofed," source addresses. In this paper, we describe a general purpose traceback mechanism based on probabilistic packet marking in the network. Our approach allows a victim to identify the network path(s) traversed by attack traffic without requiring interactive operational support from Internet Service Providers (ISPs). Moreover, this traceback can be performed "post mortem"—after an attack has completed. We present an implementation of this technology that is incrementally deployable, (mostly) backward compatible, and can be efficiently implemented using conventional technology.

*Index Terms*—Computer network management, computer network security, network servers, stochastic approximation, wide-area networks.

## I. INTRODUCTION

**D** ENIAL-OF-SERVICE attacks consume the resources of a remote host or network, thereby denying or degrading service to legitimate users. Such attacks are among the hardest security problems to address because they are simple to implement, difficult to prevent, and very difficult to trace. In the last several years, Internet denial-of-service attacks have increased in frequency, severity, and sophistication. Howard reports that between the years of 1989 and 1995, the number of such attacks reported to the Computer Emergency Response Team (CERT) increased by 50% per year [26]. More recently, a 1999 CSI/FBI survey reports that 32% of respondents detected denial-of-service attacks directed against their sites [16]. Even more worrying, recent reports indicate that attackers have developed tools to coordinate distributed attacks from many separate sites [14].

Unfortunately, mechanisms for dealing with denial-of-service have not advanced at the same pace. Most work in this area has focused on *tolerating* attacks by mitigating their effects on the victim [40], [2], [27], [30], [9]. This approach can provide an effective stopgap measure, but does not eliminate the problem, nor does it discourage attackers. The other option, and the focus of this paper, is to trace attacks back toward their origin—ideally stopping an attacker at the source.

A perfect solution to this problem is complicated by the potential use of indirection to "launder" the true causal origin of an

D. Wetherall, A. Karlin, and T. Anderson are with the Department of Computer Science and Engineering, University of Washington, Seattle, WA 98195 USA.

Publisher Item Identifier S 1063-6692(01)04726-4.

attack. For example, an attack may consist of packets sent from many different slave machines, themselves under the control of a remote master machine. Such indirection may be achieved either explicitly (by compromising the individual slave hosts directly) or implicitly (by sending false requests to the slaves on behalf of the victim—a so-called *reflector*). More challenging still, the true origin and identity of the attacker can be similarly concealed through chains of false computer accounts, call forwarding, and so forth. Consequently, we regard a complete solution—particularly one able to address the forensic needs of law enforcement—as an open problem.

Instead, we address the more limited operational goal of simply identifying the machines that *directly* generate attack traffic and the network path this traffic subsequently follows. We call this the *traceback problem* and it is motivated by the operational need to control and contain attacks. In this setting, even incomplete or approximate information is valuable because the efficacy of measures such as packet filtering improve as they are applied further from the victim and closer to the source.

However, even for our restricted problem, determining the source generating attack traffic is surprisingly difficult due to the stateless nature of Internet routing. Attackers routinely disguise their location using incorrect, or "spoofed," IP source addresses. As these packets traverse the Internet, their true origin is lost and a victim is left with little useful information. While there are several *ad hoc* traceback techniques in use, they all have significant drawbacks that limit their practical utility in the current Internet.

In this paper, we present a new approach to the traceback problem that addresses the needs of both victims and network operators. Our solution is to probabilistically mark packets with partial path information as they arrive at routers. This approach exploits the observation that attacks generally comprise large numbers of packets. While each marked packet represents only a "sample" of the path it has traversed, by combining a modest number of such packets a victim can reconstruct the entire path. This allows victims to locate the approximate source of attack traffic without requiring the assistance of outside network operators. Moreover, this determination can be made even after an attack has completed. Both facets of our solution represent substantial improvements over existing capabilities for dealing with flooding-style denial-of-service attacks.

A key practical deployment issue with any modification of Internet routers is to ensure that the mechanisms are efficiently implementable, may be incrementally deployed, and are backward compatible with the existing infrastructure. We describe a traceback algorithm that adds little or no overhead to the routers critical forwarding path and may be incrementally deployed to allow traceback within the subset of routers supporting our scheme. Further, we demonstrate that we can encode the necessary path information in a way that peacefully coexists with

Manuscript received July 17, 2000; revised November 14, 2000; approved by IEEE/ACM TRANSACTIONS ON NETWORKING Editor C. Diot.

S. Savage is with the Department of Computer Science and Engineering, University of California at San Diego, La Jolla, CA 92093 USA (e-mail: savage@cs.ucsd.edu).

TABLE I QUALITATIVE COMPARISON OF EXISTING SCHEMES FOR COMBATING ANONYMOUS ATTACKS AND THE PROBABILISTIC MARKING APPROACH PROPOSED IN THIS PAPER

|                     | Management | Network  | Router   | Distributed | Post-mortem | Preventative/ |
|---------------------|------------|----------|----------|-------------|-------------|---------------|
|                     | overhead   | overhead | overhead | capability  | capability  | reactive      |
| Ingress filtering   | Moderate   | Low      | Moderate | N/A         | N/A         | Preventative  |
| Link testing        |            |          |          |             |             |               |
| Input debugging     | High       | Low      | High     | Good        | N/A         | Reactive      |
| Controlled flooding | Low        | High     | Low      | Poor        | N/A         | Reactive      |
| Logging             | High       | Low      | High     | Excellent   | Excellent   | Reactive      |
| ICMP Traceback      | Low        | Low      | Low      | Good        | Excellent   | Reactive      |
| Marking             | Low        | Low      | Low      | Good        | Excellent   | Reactive      |

existing routers, host systems, and more than 99% of today's traffic.

The rest of this paper is organized as follows. In Section II, we describe related work concerning IP spoofing and solutions to the traceback problem. Section III outlines our basic approach and Section IV characterizes several abstract algorithms for implementing it. In Section V, we detail a concrete encoding strategy for our algorithm that can be implemented within the current Internet environment. We also present experimental results demonstrating the effectiveness of our solution. In Section VI, we discuss the main limitations and weaknesses of our proposal and potential extensions to address some of them. Finally, we summarize our findings in Section VII.

## II. RELATED WORK

It has been long understood that the IP protocol permits anonymous attacks. In his 1985 paper on TCP/IP weaknesses, Morris writes:

"The weakness in this scheme [the Internet Protocol] is that the source host itself fills in the IP source host id, and there is no provision in ... TCP/IP to discover the true origin of a packet." [32]

In addition to denial-of-service attacks, IP spoofing can be used in conjunction with other vulnerabilities to implement anonymous one-way TCP channels and covert port scanning [32], [3], [25], [46].

There have been several efforts to reduce the anonymity afforded by IP spoofing. Table I provides a subjective characterization of each of these approaches in terms of management cost, additional network load, overhead on the router, the ability to trace multiple simultaneous attacks, the ability trace attacks after they have completed, and whether they are preventative or reactive. We also characterize our proposed traceback scheme according to the same criteria. In the remainder of this section, we describe each previous approach in more detail.

#### A. Ingress Filtering

One way to address the problem of anonymous attacks is to eliminate the ability to forge source addresses. One such approach, frequently called *ingress filtering*, is to configure routers to block packets that arrive with illegitimate source addresses [21]. This requires a router with sufficient power to examine the source address of every packet and sufficient knowledge to distinguish between legitimate and illegitimate addresses. Consequently, ingress filtering is most feasible in customer networks or at the border of Internet Service Providers (ISPs) where address ownership is relatively unambiguous and traffic load is low. As traffic is aggregated from multiple ISPs into transit networks, there is no longer enough information to unambiguously determine if a packet arriving on a particular interface has a "legal" source address. Moreover, on many deployed router architectures the overhead of ingress filter becomes prohibitive on high-speed links.

The principal problem with ingress filtering is that its effectiveness depends on widespread, if not universal, deployment. Unfortunately, a significant fraction of ISPs, perhaps the majority, do not implement this service—either because they are uninformed or have been discouraged by the administrative burden,<sup>1</sup> potential router overhead, and complications with existing services that depend on source address spoofing (e.g., some versions of Mobile IP [34] and some hybrid satellite communications architectures). A secondary problem is that even if ingress filtering were universally deployed at the customer-to-ISP level, attackers could still forge addresses from the hundreds or thousands of hosts within a valid customer network [14].

It is clear that wider use of ingress filtering would dramatically improve the Internet's robustness to denial-of-service attacks. At the same time, it is prudent to assume that such a system will never be fullproof—and therefore traceback technologies will continue to be important.

#### B. Link Testing

Most existing traceback techniques start from the router closest to the victim and interactively test its upstream links until they determine which one is used to carry the attackers traffic. Ideally, this procedure is repeated recursively on the upstream router until the source is reached. This technique assumes that an attack remains active until the completion of a trace and is therefore inappropriate for attacks that are detected after the fact, attacks that occur intermittently, or attacks that modulate their behavior in response to a traceback (it is prudent to assume the attacker is fully informed). Below we describe two varieties of link testing schemes, *input debugging* and *controlled flooding*.

<sup>&</sup>lt;sup>1</sup>Some modern routers ease the administrative burden of ingress filtering by providing functionality to automatically check source addresses against the destination-based routing tables (e.g., IP verify unicast reverse-path on Cisco's IOS). This approach is only valid if the route to and from the customer is symmetric—generally at the border of single-homed stub networks.

1) Input Debugging: Many routers include a feature called input debugging, which allows an operator to filter particular packets on some egress port and determine which ingress port they arrived on. This capability is used to implement a trace as follows. First, the victim must recognize that it is being attacked and develop an *attack signature* that describes a common feature contained in all the attack packets. The victim communicates this signature to a network operator, frequently via telephone, who then installs a corresponding input debugging filter on the victim's upstream egress port. This filter reveals the associated input port, and hence which upstream router originated the traffic. The process is then repeated recursively on the upstream router, until the originating site is reached or the trace leaves the ISP's border (and hence its administrative control over the routers). In the latter case, the upstream ISP must be contacted and the procedure repeats itself. While such tracing is frequently performed manually, several ISPs have developed tools to automatically trace attacks across their own networks. One such system, called CenterTrack, provides an improvement over hop-by-hop backtracking by dynamically rerouting all of the victim's traffic to flow through a centralized tracking router [43]. Once this reroute is complete, a network operator can then use input debugging at the tracking router to investigate where the attack enters the ISP network.

The most obvious problem with the input debugging approach, even with automated tools, is its considerable management overhead. Communicating and coordinating with network operators at multiple ISPs requires the time, attention, and commitment of both the victim and the remote personnel—many of whom have no direct economic incentive to provide aid. If the appropriate network operators are not available, if they are unwilling to assist, or if they do not have the appropriate technical skills and capabilities, then a traceback may be slow or impossible to complete [22].

2) Controlled Flooding: Burch and Cheswick have developed a link-testing traceback technique that does not require any support from network operators [6]. We call this technique controlled flooding because it tests links by flooding them with large bursts of traffic and observing how this perturbs traffic from the attacker. Using a pregenerated "map" of Internet topology, the victim coerces selected hosts along the upstream route into iteratively flooding each incoming link on the router closest to the victim. Since router buffers are shared, packets traveling across the loaded link-including any sent by the attacker-have an increased probability of being dropped. By observing changes in the rate of packets received from the attacker, the victim can therefore infer which link they arrived from. As with other link testing schemes, the basic procedure is then applied recursively on the next upstream router until the source is reached.

While the scheme is both ingenious and pragmatic, it has several drawbacks and limitations. Most problematic among these is that controlled flooding is itself a denial-of-service attack—exploiting vulnerabilities in unsuspecting hosts to achieve its ends. This drawback alone makes it unsuitable for routine use. Also, controlled flooding requires the victim to have a good topological map of large sections of the Internet in addition to an associated list of "willing" flooding hosts. As Burch and Cheswick note, controlled flooding is also poorly suited for tracing distributed denial-of-service attacks because the link-testing mechanism is inherently noisy and it can be difficult to discern the set of paths being exploited when multiple upstream links are contributing to the attack. Finally, like all link-testing schemes, controlled flooding is only effective at tracing an ongoing attack and cannot be used "post mortem."

## C. Logging

An approach suggested in [38] and [43] is to log packets at key routers and then use data mining techniques to determine the path that the packets traversed. This scheme has the useful property that it can trace an attack long after the attack has completed. However, it also has obvious drawbacks, including potentially enormous resource requirements (possibly addressed by sampling) and a large scale interprovider database integration problem. We are unaware of any commercial organizations using a fully operational traceback approach based on logging.<sup>2</sup>

## D. ICMP Traceback

Since the first writing of this paper, a new traceback proposal has emerged based on the use of explicit router-generated ICMP traceback messages [4]. The principle idea in this scheme is for every router to sample, with low probability (e.g., 1/20 000), one of the packets it is forwarding and copy the contents into a special ICMP Traceback message including information about the adjacent routers along the path to the destination. During a flooding-style attack, the victim host can then use these messages to reconstruct a path back to the attacker. This scheme has many benefits compared to previous work and is in many ways similar to the packet marking approach we have taken. However, there are several disadvantages in the current design that complicate its use. Among these: ICMP traffic is increasingly differentiated and may itself be filtered in a network under attack; the ICMP Traceback message relies on an input debugging capability (i.e., the ability to associate a packet with the input port and/or MAC address on which it arrived) that is not available in some router architectures; if only some of the routers participate it seems difficult to positively "connect" traceback messages from participating routers separated by a nonparticipating router; and finally, it requires a key distribution infrastructure to deal with the problem of attackers sending false ICMP Traceback messages. That said, we believe that the scheme is promising and that hybrid approaches combining it with some of the algorithms we propose are likely to be quite effective.

#### **III. OVERVIEW**

Burch and Cheswick mention the possibility of tracing flooding attacks by "marking" packets, either probabilistically or deterministically, with the addresses of the routers they traverse [6]. The victim uses the information in the marked packets to trace an attack back to its source. This approach has not been previously explored in any depth, but has many

<sup>&</sup>lt;sup>2</sup>Historically, the T3-NFSNET *did* log network-to-network traffic statistics and these were used on at least one occasion to trace IP spoofing attacks to an upstream provider [45].

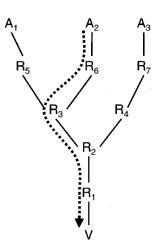


Fig. 1. Network as seen from the victim of an attack, V. Routers are represented by  $R_i$ , and potential attackers by  $A_i$ . The dotted line represents a particular *attack path* between an attacker and the victim.

potential advantages. It does not require interactive cooperation with ISPs and therefore avoids the high management overhead of input debugging. Unlike controlled flooding, it does not require significant additional network traffic and can potentially be used to track multiple attacks. Moreover, like logging, packet marking can be used to trace attacks "post mortem" – long after the attack has stopped. Finally, we have found that marking algorithms can be implemented without incurring any significant overhead on network routers. The remainder of this paper focuses on fully exploring and characterizing this approach.

#### A. Definitions

Fig. 1 depicts the network as seen from a victim V. For the purposes of this paper, V may be a single host under attack, or a network border device such as a firewall or intrusion detection system that represents many such hosts. Every potential *attack* origin  $A_i$  is a leaf in a tree rooted at V and every router  $R_i$  is an internal node along a path between some  $A_i$  and V. The *attack* path from  $A_i$  is the unique ordered list of routers between  $A_i$  and V. For instance, if an attack originates from  $A_2$ , then to reach V it must first traverse the path  $R_6$ ,  $R_3$ ,  $R_2$ , and  $R_1$ —as shown by the dotted line in Fig. 1.

The *exact traceback* problem is to determine the attack path and the associated attack origin for each attacker. However, solving this problem is complicated by several practical limitations. The exact attack origin may never be revealed (even MAC source addresses may be spoofed) and a wily attacker may send false signals to "invent" additional routers in the traceback path. We address these issues in Section VI, but for now we restrict our discussion to solving a more limited problem. We define the *approximate traceback* problem as finding a candidate attack path for each attacker that contains the true attack path as a suffix. We call this the valid suffix of the candidate path. For example,  $(R_5, R_6, R_3, R_2, R_1)$  is a valid approximate solution to Fig. 1 because it contains the true attack path as a suffix. We say a solution to this problem is robust if an attacker cannot prevent the victim from discovering candidate paths containing the valid suffix.

All marking algorithms have two components: a *marking procedure* executed by routers in the network and a *path reconstruction procedure* implemented by the victim. A router "marks" one or more packets by augmenting them with additional information about the path they are traveling. The victim attempts to reconstruct the attack path using only the information in these marked packets. The *convergence time* of an algorithm is the number of packets that the victim must observe to reconstruct the attack path.

#### B. Basic Assumptions

The design space of possible marking algorithms is large, and to place our work in context we identify the assumptions that motivate and constrain our design.

- An attacker may generate any packet.
- Multiple attackers may conspire.
- · Attackers may be aware they are being traced.
- · Packets may be lost or reordered.
- Attackers send numerous packets.
- The route between attacker and victim is fairly stable.
- Routers are both CPU and memory limited.
- Routers are not widely compromised.

The first four assumptions represent conservative assessments of the abilities of the modern attackers and limitations of the network. Designing a traceback system for the Internet environment is extremely challenging because there is very little that can be trusted. In particular, the attackers ability to create arbitrary packets significantly constrains potential solutions. When a router receives a packet, it has no way to tell whether that packet has been marked by an upstream router or if the attacker simply has forged this information. In fact, the only invariant that we can depend on is that a packet from the attacker must traverse all of the routers between it and the victim.

The remaining assumptions reflect the basis for our design and deserve additional discussion. First, denial-of-service attacks are only effective so long as they occupy the resources of the victim. Consequently, most attacks are comprised of thousands or millions of packets. Our approach relies on this property because we mark each packet with only a small piece of path state and the victim must observe many such packets to reconstruct the complete path back the the attacker. If many attacks emerge that require only a single packet to disable a host (e.g., ping-of-death [11]), then this assumption may not hold (although we note that even these attacks require multiple packets to *keep* a machine down).

Second, measurement evidence suggests that while Internet routes do change, it is extremely rare for packets to follow many different paths over the short timescales of a traceback operation (seconds in our system) [33]. This assumption greatly simplifies the role of the victim, since it can therefore limit its consideration to a single primary path for each attacker. If the Internet evolves to allow significant degrees of multipath routing, then this assumption may not hold.

Third, while there have been considerable improvements in router implementation technology, link speeds have also increased dramatically. Consequently, we assert that any viable Marking procedure at router R: for each packet w, append R to w

Path reconstruction procedure at victim v: for any packet w from attacker extract path  $(R_i..R_j)$  from the suffix of w

Fig. 2. Node append algorithm.

implementation must have low per-packet overhead and must not require per-flow state. Significantly simpler schemes than ours can be implemented if we assume that routers are not resource constrained.

Finally, since a compromised router can effectively eliminate any information provided by upstream routers, it is effectively indistinguishable from an attacker. In such circumstances, the security violation at the router must be addressed first, before any further traceback is attempted. In normal circumstances, we believe this is an acceptable design point. However, if nonmalicious, but information hiding, routing infrastructures become popular, such as described in [23], [36], then this issue may need to be revisited.

### **IV. BASIC MARKING ALGORITHMS**

In this section, we describe a series of marking algorithms—starting from the most simple and advancing in complexity. Each algorithm attempts to solve the approximate traceback problem in a manner consistent with our assumptions.

## A. Node Append

The simplest marking algorithm—conceptually similar to the IP Record Route option [35]—is to append each node's address to the end of the packet as it travels through the network from attacker to victim (see Fig. 2). Consequently, every packet received by the victim arrives with a complete ordered list of the routers it traversed—a built-in attack path.

The node append algorithm is both robust and extremely quick to converge (a single packet), however, it has several serious limitations. Principal among these is the infeasibly high router overhead incurred by appending data to packets in flight. Moreover, since the length of the path is not known *a priori*, it is impossible to ensure that there is sufficient unused space in the packet for the complete list. This can lead to unnecessary fragmentation and bad interactions with services such as MTU discovery [31]. This problem cannot be solved by reserving "enough" space, as the attacker can completely fill any such space with false, or misleading, path information.

## B. Node Sampling

To reduce both the router overhead and the per-packet space requirement, we can sample the path one node at a time instead of recording the entire path. A single static "node" field is reserved in the packet header—large enough to hold a single router address (i.e., 32 bits for IPv4). Upon receiving a packet, each router chooses to write its address in the node field with some probability p. After enough packets have been sent, the

```
Marking procedure at router R:for each packet wlet x be a random number from [0..1)if x < p then,write R into w.nodePath reconstruction procedure at victim v:let NodeTbl be a table of tuples (node,count)for each packet w from attackerz := lookup w.node in NodeTblif z != NIL thenincrement z.countelseinsert tuple (w.node,1) in NodeTblsort NodeTbl by countextract path (R_i..R_j) from ordered node fields in NodeTbl
```

Fig. 3. Node sampling algorithm.

victim will have received at least one sample for every router in the attack path. As stated in Section III, we assume that the attacker sends enough packets and the route is stable enough that this sampling can converge.

Although it might seem impossible to reconstruct an ordered path given only an unordered collection of node samples, it turns out that with a sufficient number of trials, the order can be deduced from the relative number of samples per node. Since routers are arranged serially, the probability that a packet will be marked by a router and then left unmolested by all downstream routers is a strictly decreasing function of the distance to the victim. If we constrain p to be identical at each router, then the probability of receiving a marked packet from a router d hops away is  $p(1-p)^{d-1}$ . Since this function is monotonic in the distance from the victim, ranking each router by the number of samples it contributes will tend to produce the accurate attack path. The full algorithm is shown in Fig. 3.

Putting aside for the moment the difficulty in changing the IP header to add a 32-bit node field, this algorithm is efficient to implement because it only requires the addition of a write and checksum update to the forwarding path. Current high-speed routers already must perform these operations efficiently to update the *time-to-live* field on each hop. Moreover, if p > 0.5 then this algorithm is robust against a single attacker because there is no way for an attacker to insert a "false" router into the paths valid suffix by contributing more samples than a downstream router, nor to reorder valid routers in the path by contributing more samples than the difference between any two downstream routers.

However, there are also two serious limitations. First, inferring the total router order from the distribution of samples is a slow process. Routers far away from the victim contribute relatively few samples (especially since p must be large) and random variability can easily lead to misordering unless a very large number of samples are observed. For instance, if d =15 and p = 0.51, the receiver must receive more than 42 000 packets on average before it receives a *single* sample from the furthest router. To guarantee that the order is correct with 95% certainty requires more than seven times that number.

Second, if there are multiple attackers, then multiple routers may exist at the same distance—and hence be sampled with the sample probability. Therefore, this technique is not robust against multiple attackers.

## C. Edge Sampling

A straightforward solution to these problems is to explicitly encode *edges* in the attack path rather than simply individual nodes. To do this, we would need to reserve *two* static addresssized fields, *start* and *end*, in each packet to represent the routers at each end of a link, as well as an additional small field to represent the distance of an edge sample from the victim.

When a router decides to mark a packet, it writes its own address into the start field and writes a zero into the distance field. Otherwise, if the distance field is already zero this indicates that the packet was marked by the previous router. In this case, the router writes its own address into the end field—thereby representing the edge between itself and the previous router—and increments the distance field to one. Finally, if the router does not mark the packet, then it always increments the distance field. This somewhat baroque signaling mechanism allows edge sampling to be incrementally deployed—edges are constructed only between participating routers.

The mandatory increment is *critical* to minimize spoofing by an attacker. When the packet arrives at the victim its distance field represents the number of hops traversed since the edge it contains was sampled.<sup>3</sup> Any packets written by the attacker will necessarily have a distance greater or equal to the length of the true attack path. Therefore, a single attacker is unable to forge any edge between themselves and the victim (for a distributed attack, of course, this applies only to the closest attacker) and the victim does not have to worry about "chaff" while reconstructing the valid suffix of the attack path. Consequently, since we no longer use the sampling rank approach to distinguish "false" samples, we are free to use arbitrary values for the marking probability p.

The victim uses the edges sampled in these packets to create a graph (much as in Fig. 1) leading back to the source, or sources, of attack. The full algorithm is described in Fig. 4. Because the probability of receiving a sample is geometrically smaller the further away it is from the victim, the time for this algorithm to converge is dominated by the the time to receive a sample from the furthest router,  $1/p(1-p)^{d-1}$  in expectation, for a router d hops away. However, there is also a small probability that we will receive a sample from the furthest router, but not from some nearer router. We can bound this effect to a factor of  $\ln(d)$  by the following argument. We conservatively assume that samples from all of the d routers appear with the same likelihood as the furthest router. Since these probabilities are disjoint, the probability that a given packet will deliver a sample from some router is at least  $dp(1-p)^{d-1}$ . Finally, as per the well-known *coupon* collector problem, the expected number of trials required to select one of each of d equiprobable items is  $d(\ln(d)+O(1))^4$ [20]. Marking procedure at router R:for each packet wlet x be a random number from [0..1)if x < p thenwrite R into w.start and 0 into w.distanceelseif w.distance = 0 thenwrite R into w.endincrement w.distance

Path reconstruction procedure at victim v: let G be a tree with root v let edges in G be tuples (start,end,distance) for each packet w from attacker if w.distance = 0 then insert edge (w.start,v,0) into G else insert edge (w.start,w.end,w.distance) into G

remove any edge (x,y,d) with  $d \neq$  distance from x to v in G extract path  $(R_i..R_j)$  by enumerating acyclic paths in G

Fig. 4. Edge sampling algorithm.

Therefore, the number of packets X required for the victim to reconstruct a path of length d has the following bounded expectation:

$$E(X) < \frac{\ln(d)}{p(1-p)^{d-1}}.$$

For example, if p = 1/10, and the attack path has a length of 10, then a victim can typically reconstruct this path after receiving 75 packets from the attacker. While this choice of p = 1/d is optimal, the convergence time is not overly sensitive to this parameter for the path lengths that occur in the Internet. So long as  $p \le 1/d$ , the results are generally within a small constant of optimal. In the rest of this paper, we will use p = 1/25 since few paths exceed this length [7], [44], [17]. For comparison, the previous example converges with only 108 packets using p = 1/25.

This same algorithm can efficiently discern multiple attacks because attackers from different sources produce disjoint edges in the tree structure used during reconstruction. The number of packets needed to reconstruct each path is independent, so the number of packets needed to reconstruct all paths is a linear function of the number of attackers. Finally, edge sampling is also robust. That is, it is impossible for any edge closer than the closest attacker to be spoofed, due to the robust distance determination. Conversely, in a distributed attack this also means that it is impossible to trust the contents of any edge *further* away than the closest attacker. As with the ICMP Traceback approach [4], an additional mechanism incorporating a shared secret is required to completely address the problem of attackers spoofing edges.

Of course, a significant practical limitation of this approach is that it requires additional space in the IP packet header and therefore is not backward compatible. In the next section, we discuss a modified version of edge sampling that addresses this problem, albeit at some cost in performance and a reduction in robustness during large distributed attacks.

<sup>&</sup>lt;sup>3</sup>It is important that distance field is updated using a saturating addition. If the distance field were allowed to wrap, then the attacker could spoof edges close to the victim by sending packets with a distance value close to the maximum.

<sup>&</sup>lt;sup>4</sup>More exactly, the expression is  $d(\ln(d) + \gamma)$ , where  $\gamma$  represents Euler's constant. For simplicity, we ignore this small constant when describing the expectation, although we include its effect when we perform calculations.

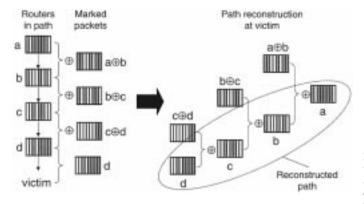


Fig. 5. Edge data can be communicated in half the space by sending the XOR of the two nodes (i.e., router IP addresses) making up an edge, rather than sending each node separately. Over time the victim receives the messages  $d, c \oplus d, b \oplus c$ , and  $a \oplus b$ . By XORing these messages together, the original path can be reconstructed.

#### V. ENCODING ISSUES

The edge-sampling algorithm requires 72 bits of space in every IP packet (two 32-b IP addresses and 8 bits for distance to represent the theoretical maximum number of hops allowed using IP). It would be possible to directly encode these values into an MPLS label stack [37], to enable traceback within a single homogeneous ISP network. However, our focus is on a heterogeneous environment based purely on IP datagrams. One obvious approach is to store the edge sample data in an IP option, but this is a poor choice for many of the same reasons that the node append algorithm is infeasible—appending additional data to a packet in flight is expensive and there may not be sufficient space to append this data. We could also send this data out-of-band—in a separate packet—but this would add both router and network overhead plus the complexity of a new and incompatible protocol.

Instead, we have developed a modified version of edge sampling that dramatically reduces the space requirement in return for a modest increase in convergence time and a reduction in robustness to multiple attackers. Following an analysis of our algorithm, we explore the practical implementation issues and discuss one concrete encoding of this scheme based on overloading the 16-b IP *identification* field used for fragmentation. Any solution involving such overloading necessarily requires compromises and we stress that our solution reflects only one design point among many potential implementation tradeoffs for this class of algorithm and *does not* necessarily reflect an optimal balance among them.

#### A. Compressed Edge Fragment Sampling

We use three techniques to reduce per-packet storage requirements while preserving robustness. First, we encode each edge in half the space by representing it as the *exclusive-or* (XOR) of the two IP addresses making up the edge, as depicted in Fig. 5. When some router decides to mark a packet, it writes its address a into the packet. The following router, b, notices that the distance field is 0 and (assuming it does not mark the packet itself) reads a from the packet, XORs this value with its own address, and writes the resulting value,  $a \oplus b$ , into the packet. We call the

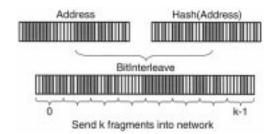


Fig. 6. Each router calculates a uniform hash of its IP address once, at startup, using a well-known function. This hash is interleaved with the original IP address (the original address on odd bits, the hash on even bits). The resulting quantity is then broken into k fragments, which the router selects among randomly when marking a packet. Although it is not shown, each of these fragments is further labeled with its offset. The next downstream router uses this offset to select the appropriate fragment to XOR—thereby encoding part of an edge.

resulting value the *edge-id* for the edge between a and b. The edge-ids in the packets received by the victim always contain the XOR of two adjacent routers, except for samples from routers one hop away from the victim, which arrive unmodified. Since  $b \oplus a \oplus b = a$ , marked packets from the final router can be used to decode the previous edge id, and so on, hop-by-hop until we reach the first router.

Our second modification further reduces our per-packet space requirements by subdividing each edge-id into some number kof smaller nonoverlapping fragments. When a router decides to mark a packet, it selects one of these fragments at random and stores it in the packet. We use a few additional bits  $(\log_2 k)$  to store the offset of this fragment within the original address—this is necessary to ensure that different fragments from an edge-id can be recombined in the correct order. If enough packets are sent by the attacker, the victim will eventually receive all fragments from all edge-ids.

Finally, unlike full IP addresses, edge-id fragments are not unique and multiple fragments from different edge-ids may have the same value. If there are multiple attackers, a victim may receive multiple edge fragments with the same offset and distance. To reduce the probability of accidentally reconstructing a "false" edge-id by combining fragments from different paths, we add a simple error detection code to our algorithm. We increase the size of each router address, and hence each edge-id, by bit-interleaving its IP address with a random hash of itself (depicted in Fig. 6). As described earlier, this value is split into fragments, each fragment is selected randomly and stored with an offset, and downstream routers use XOR to combine fragments at the same offset to make up edge-id fragments. The victim constructs *candidate edge-ids* by combining all combinations of fragments at each distance with disjoint offset values. As shown in Fig. 7, a candidate edge-id is only accepted if the hash portion matches the data portion for each of its two nodes. As we increase the size of the hash, the probability of a collision is reduced. We describe the full procedure in Fig. 8.

The expected number of packets for this algorithm to converge is similar to the edge sampling approach, except now we need k fragments for each edge-id, rather than just one, a total of kd fragments. If we again assume conservatively that each of these fragments is delivered equiprobably with probability

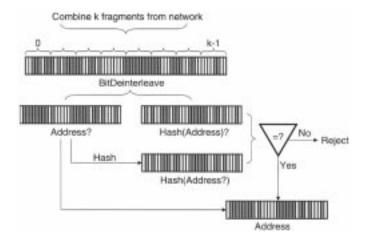


Fig. 7. When reconstructing a candidate edge, the victim combines k fragments to produce a bit string. By de-interleaving this string, the address portion and the hash portion are extracted. We recalculate the hash over this address portion using the same hash function used by the router. If the resulting hash is the same as the hash portion extracted, then the address is accepted as valid. This procedure protects against accidentally combining fragments of different edges.

 $p(1-p)^{d-1}$ , the expected number of packets required for path reconstruction is bounded by

$$E(X) < \frac{k \cdot \ln(kd)}{p(1-p)^{d-1}}$$

For example, if there are eight fragments per edge-id, an attacker is ten hops away, and p = 1/25, then a victim can reconstruct the full path after receiving slightly less than 1300 packets on average. Using techniques similar to those used to show sharp concentration results for the coupon collectors problem, we can further show that the approximate the number of packets required to ensure that a path can be reconstructed with probability 1 - 1/c is

$$\frac{k \cdot \ln(kdc)}{p(1-p)^{d-1}}$$

packets. To completely reconstruct the previous path with 95% certainty should require no more than 2150 packets. Many denial-of-service attacks send this many packets in a few seconds.

Finally, we explore the robustness of this algorithm with respect to multiple attackers. For a random hash of length h, the probability of accepting an arbitrarily constructed candidate edge-id is  $1/2^h$ . In the event that there are m attackers, then at any particular distance d, in the worst case there may be up to m distinct routers.<sup>5</sup> Consequently, the probability that any edge-id at distance d is accepted incorrectly is at most

$$1 - \left(1 - \frac{1}{2^h}\right)^{m^h}$$

since there are  $m^k$  possible combinations of fragments in the worst case. For h = 32 and k = 4 this means that 100 distinct

```
Marking procedure at router R:
  let R' = BitIntereave(R, Hash(R))
  let k be the number of non-overlapping fragments in R'
  for each packet w
    let x be a random number from [0..1)
    if x < p then
       let o be a random integer from [0..k - 1]
       let f be the fragment of R' at offset o
       write f into w.frag
       write 0 into w.distance
       write o into w.offset
     else
       if w.distance = 0 then
          let f be the fragment of R' at offset w.offset
          write f \oplus w.frag into w.frag
       increment w.distance
```

Path reconstruction procedure at victim v: let *FragTbl* be a table of tuples (frag, offset, distance) let G be a tree with root vlet edges in G be tuples (start,end,distance) let maxd := 0let last := vfor each packet w from attacker *FragTbl*.Insert(*w*.frag,*w*.offset,*w*.distance) if w.distance > maxd then maxd := w.distancefor d := 0 to maxd for all ordered combinations of fragments at distance dconstruct edge zif  $d \neq 0$  then  $z := z \oplus last$ if Hash(EvenBits(z)) = OddBits(z) then insert edge (z, EvenBits(z), d) into G last := EvenBits(z);remove any edge (x,y,d) with  $d \neq$  distance from x to v in G extract path  $(R_i..R_j)$  by enumerating acyclic paths in G

Fig. 8. Compressed edge fragment sampling algorithm.

routers at the same distance (i.e., disjoint attack paths) will be resolved with no errors with a probability of better than 97%. For h = 32 and k = 8 (the values we use for our implementation), the same certainty can only be provided for ten distinct routers at the same distance. Our use of the XOR function further complicates reconstruction since all combinations of XOR values must be tried as attack paths diverge. This is somewhat mitigated as the probability of propagating an error from a single edge all the way to the attacker is is extremely small because the resulting edge-id, when XORed with the previous edge-id, must again produce a correct hash.

The most significant drawback to this scheme is the large number of combinations that must be considered as the multiple attack paths diverge. While these combinations can be computed off-line, for large values of k and m even this can become intractable. For example, even with k = 8 and m = 10, if the separate attack paths diverge such that there are ten completely independent edges per attacker, this will require roughly a billion combinations to be considered. Consequently, there is a design tension in the size of k – per-packet space overhead is reduced by a larger k, while computational overhead and robustness benefits from a smaller k.

<sup>&</sup>lt;sup>5</sup>In practice, the number of distinct routers is likely to be smaller for the portion of the path closest to the receiver, since many attackers will still share significant portions of their attack path with one another.

ver hlen TOS total length identification offset ilas header checksum time to live protocol source IP address destination IP address offset distance edge fragment 3 78 15 0 2

Fig. 9. Encoding edge fragments into the IP identification field.

#### B. IP Header Encoding

To allow for practical deployment requires that we "overload" existing header fields in a manner that will have minimal impact on existing users. This is a difficult task, especially given that even after prodigious effort we require 16 bits of space. Nonetheless, we believe it possible to obtain this space by overloading the 16-b IP identification field. This field is currently used to differentiate IP fragments that belong to different packets. We describe our proposed encoding below, and then discuss the issues of backward-compatibility that it raises. However, we note that because the issue of backward-compatible encoding is largely separate from our traceback algorithms, we could adopt any reasonable encoding that comes to light.

Fig. 9 depicts our choice for partitioning the identification field: three offset bits to represent eight possible fragments, five bits to represent the distance, and eight bits for the edge fragment. We use a 32-b hash, which doubles the size of each router address to 64 bits. This implies that eight separate fragments are needed to represent each edge-each fragment indicated by a unique offset value. Finally, five bits is sufficient to represent 31 hops, which is more than almost all Internet paths [7], [44], [17].6

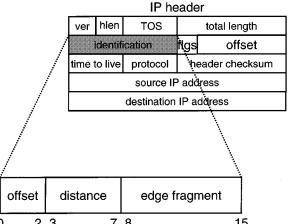
The observant reader will note that this layout is chosen to allow the highest performance software implementation of our algorithm, which already had a low per-packet router overhead. In the common case, the only modification to the packet is to increment its distance field. Because of its alignment within the packet, this increment precisely offsets the required decrement of the time-to-live field implemented by each router [1]. Consequently, the header checksum does not need to be altered at all and the header manipulation overhead could be even lower than in current software-based routers-simply an addition to the distance field, a decrement to the TTL field, and a comparison to check if either has overflowed. In the worst case, our algorithm must read the IP identification field, lookup an edge fragment and XOR it, and fold the write-back into the existing checksum update procedure (a few ALU operations). Of course, for modern ASIC-based routers these optimizations are unnecessary.

As we reuse the IP identification field, we must address issues of backward compatibility for IP fragment traffic. Ultimately, there is no perfect solution to this problem and we are forced to make compromises that disadvantage fragmented traffic. Fortunately, recent measurements suggest that less than 0.25% of packets are fragmented [42], [10]. Moreover, it has long been understood that network-layer fragmentation is detrimental to end-to-end performance [28] so modern network stacks implement automatic MTU discovery to prevent fragmentation regardless of the underlying media [31]. Consequently, we believe that our encoding will interoperate seamlessly with existing protocol implementations in the vast majority of cases.

However, there is a small but real fraction of legitimate traffic that is fragmented, and we wish to ensure that it is not affected by our modifications to the extent that this is possible. Normally if a packet is fragmented, its identification field is copied to each fragment so the receiver can faithfully reassemble the fragments into the original packet. Our marking procedure can violate this property in one of two ways: by writing different values into the identification fields of fragments from the same datagram or by writing the same values into the identification fields of fragments from different datagrams. These two problems present different challenges and have different solutions.

First, a datagram may be fragmented upstream from a marking router. If the fragment is subsequently marked and future fragments from the same datagram are not marked consistently then reassembly may fail or data may be corrupted. While the simplest solution to this problem is to simply not mark fragments, an adversary would quickly learn to evade traceback by exploiting this limitation. In fact, some current denial-of-service attacks already use IP fragments to exploit errors in host IP reassembly functions [12]. Instead, we propose an alternative marking mechanism for fragments. We use a separate marking probability, q, for fragments. When we decide to mark a fragment, we prepend a new ICMP "echo reply" header, along with the *full* edge data-truncating the tail of the packet. This ICMP packet is considered "marked" and its distance field is set to zero, thereby guaranteeing that the distance field reflects the number of edges traversed on the way to the victim. The packet is consequently "lost" from the standpoint of the receiver, but the edge information is delivered in a way that does not impact legacy hosts. Because we can use the full edge sampling algorithm, q can be more than an order of magnitude smaller than p and yet achieve the same convergence time. This solution increases the loss rate of fragmented flows somewhat (more substantially for longer paths) but preserves the integrity of the data in these flows.

A more insidious problem is presented by fragmentation that occurs downstream from a marking router. If a marked packet is fragmented, but one of the fragments is lost, then the remaining fragments may linger in the victims reassembly buffer for an extended period [5]. Future packets marked by the same router can have the same IP identification value and consequently may be incorrectly reassembled with the previous fragments. One possibility is to leave this problem to be dealt with by higher



<sup>&</sup>lt;sup>6</sup>It is also reasonable to turn off marking on any routers that cannot be directly connected to an attacking host (e.g., core routers). This both reduces the convergence time, and increases the "reach" of the distance field.

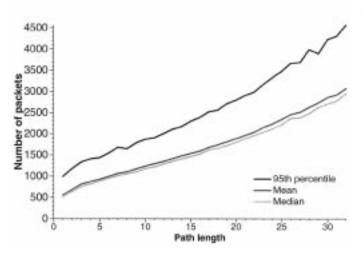


Fig. 10. Experimental results for number of packets needed to reconstruct paths of varying lengths. The marking probability p is set to 1/25. Each path length result represents the results of 1000 independent simulation runs.

layer checksums. However, not all higher layer protocols employ checksums, and in any case it is dangerous to rely on such checksums because they are typically designed only for low residual error rates. Another solution is to set the *Don't Fragment* flag on every marked packet. Along rare paths that require fragmentation, this solution will degrade communication between hosts not using MTU path discovery, and may filter marked packets if a reduced MTU edge is close to the victim, but it will never lead to data corruption.

## C. Assessment

We have implemented the marking and reconstruction portions of our algorithm and have tested it using a simulator that creates random paths and originates attacks. In Fig. 10, we graph the mean, median, and 95th percentile for the number of packets required to reconstruct paths of varying lengths over 1000 random test runs for each length value. We assume a marking probability of 1/25. Note that while the convergence time is theoretically exponential in the path length, all three lines appear linear due to the finite path length and appropriate choice of marking probability.

We see that most paths can be resolved with between one and two thousand packets, and even the longest paths can be resolved with a very high likelihood within 4000 packets. To put these numbers in context, most flooding-style denial of service attacks send many hundreds or thousands of packets each second. The analytic bounds we described earlier are conservative, but in our experience they are no more than 30% higher than our experimental results.

#### VI. LIMITATIONS AND FUTURE WORK

There are still a number of limitations and loose ends in our approach. We discuss the most important of these here:

- backward compatibility;
- distributed attacks;
- path validation;
- approaches for determining the attack origin.

#### A. Backward Compatibility

The IP header encoding as we have described it has several practical limitations. It negatively impacts users that require fragmented IP datagrams and is incompatible with parts of IPsec [29] (the authentication header provides cryptographic protection for the identification field and therefore the field cannot be safely modified by routers). These problems are hardly unique to our traceback technique and are inherent limitations that come about from attempting to coexist with or co-opt protocol features that did not anticipate a new use. One way to partially address this issue, originally proposed by Hawkinson, is to selectively enable traceback support in response to operational needs. A "request for traceback" from a particular network could be encoded as a BGP attribute in the networks route advertisement. Routers receiving such an advertisement would enable traceback support on packets destined for that network. Since a network requesting such support is presumably already suffering under an attack, any minor service degradation for fragmented flows would be acceptable.

Finally, our scheme does not address implementation in IPv6, the proposed successor to IPv4, which does not have an identification field [19]. While we do not attempt to propose a complete encoding here, we believe that the same techniques we have proposed could also be employed within IPv6, perhaps by overloading the 24-b *flow label* field (without any further modifications this would result in roughly a factor of three increase in the number of packets required to reconstruct a path).

## B. Distributed Attacks

For moderate distributed attacks, the implementation we have described has serious limitations due to the difficulty in correctly grouping fragments together. Consequently, the probability of misattributing an edge, as well as the amount of state needed to evaluate this decision, increases very quickly with the fanout of an attack. There is ongoing work by several groups to develop improved marking algorithms to address this deficiency. Song and Perrig leverage the additional assumption of a network topology map to compress the representation of edge state—thereby vastly improving the robustness against distributed attack [39]. Dean, Franklin, and Stubblefield also improve robustness by replacing our *ad hoc* XOR-based marking approach with one based on algebraic coding theory [18]. There is significant future work in designing alternative encoding methods that scale their robustness as they receive more data.

## C. Path Validation

Some number of the packets sent by the attacker are unmarked by intervening routers. The victim cannot differentiate between these packets and genuine marked packets. Therefore an attacker could insert "fake" edges by carefully manipulating the identification fields in the packets it sends. While the distance field prevents an attacker from spoofing edges between it and the victim—what we call the *valid suffix* – nothing prevents the attacker from spoofing extra edges past the end of the true attack path.

There are several ways to identify the valid suffix within a path generated by the reconstruction procedure. With minimal knowledge of Internet topology, one can differentiate between routers that belong to transit networks (e.g., ISPs) and those which belong to stub networks (e.g., enterprise networks). Generally speaking, a valid path will never enter a stub network and then continue into a transit network. Moreover, simple testing tools such as traceroute should enable a victim to determine if two networks do, in fact, connect. More advanced network maps [8], [24] can resolve this issue in an increasing number of cases.

A more general mechanism is to provide each router with a time-varying "secret" that is used to authenticate each marked packet (minimally, one bit in the IP header). When the victim wants to validate a router in the path, it could contact the associated network (possibly out of band, via telephone or e-mail) and obtain the secret(s) used by the router at the time of the attack. To guard against replay, the secret must be varied relatively quickly and hashed with the packet contents. Since the attacker will not know the routers secret, the forged edge-id fragments will not contain a proper authentication code. By eliminating edge-ids for which the the constituent fragments can not be validated, the candidate attack path can be pruned to only include the valid suffix. This rough idea is developed much further in Song and Perrig's traceback proposal [39].

#### D. Attack Origin Detection

While our IP-level traceback algorithm could be an important part of the solution for stopping denial-of-service attacks, it is by no means a complete solution. Our algorithm attempts to determine the approximate origin of attack traffic-in particular, the earliest traceback-capable router involved in forwarding attack traffic from the source that directly generated it. As mentioned earlier, there are a number of reasons why this may differ from the true source of the attack: attackers can hide their true identities by "laundering" attacks through third parties, either indirectly (e.g., smurf attacks [13] or DNS reflectors [15]) or directly via compromised "stepping stone" machines or IP-in-IP tunnels. While there is on-going work on following attackers through intermediate hosts [47], [41], there are still significant challenges in developing a generally applicable and universally deployable solution to this problem. One interesting possibility enabled by the packet marking approach is to extend traceback across "laundering points." For example, identifying marks could be copied from a DNS request packet into the associated DNS reply, thereby allowing the victim to trace the full causal path. However, this would also increase the required path length to be reconstructed in such cases—possibly exceeding the limited space in the length field.

Even in absence of such "laundering," our approach does not reveal the actual host originating the attack. Moreover, since hosts can forge both their IP source address and MAC address the origin of a packet may never be explicitly visible. On shared media such as FDDI rings, this problem can only be solved by explicit testing. However, on point-to-point media, the input port a packet arrives on is frequently enough to determine its true origin. On other media, there may be a MAC address, cell number, channel, or other hint that would help to locate the attack origin. In principle, our algorithm could be modified to report this information by occasionally marking packets with a special edge-id representing a link between the router and the input port on which the packet arrived (or other "hint" information). We have not explored the design of such a feature in any depth.

Finally, traceback is only effective at finding the source of *at*tack traffic, not necessarily the *attacker* themselves. Stopping an attack may be sufficient to eliminate an immediate problem, but long term disincentives may require a legal remedy and therefore the forensic means to determine an attackers identity. Even with perfect traceback support, unambiguously identifying a sufficiently skilled and cautious attacker is likely to require cooperation from law enforcement and telecommunications organizations.

#### VII. CONCLUSION

In this paper, we have argued that denial-of-service attacks motivate the development of improved traceback capabilities and we have explored traceback algorithms based on packet marking in the network. We have shown that this class of algorithm, best embodied in edge sampling, can enable efficient and robust multiparty traceback that can be incrementally deployed and efficiently implemented. As well, we have developed variant algorithms that sacrifice convergence time and robustness for reduced per-packet space requirements. Finally, we have suggested one potential deployment strategy using such an algorithm based on overloading existing IP header fields and we have demonstrated that this implementation is capable of fully tracing an attack after having received only a few thousand packets. We believe our solution represents a valuable first step toward an automated network-wide traceback facility. Several areas remain to be addressed in future work, such as improving robustness under distributed attacks and tracing past points of indirection such as reflectors.

#### ACKNOWLEDGMENT

This paper has benefited from conversations with many different people—far more than can be acknowledged completely here. Still, the authors would like to particularly thank B. Cheswick and H. Burch for early access to their work in this area, S. McCreary and K.C. Claffy for access to their packet trace data, A. Wolman for help with jgraph, P. Pardyak, M. Swift, N. Spring, G. Bartels, R. Grimm, and G. Voelker for commenting on early drafts of the paper, and constructive feedback from V. Paxson, C. Partridge, J. Hawkinson, R. Stone, J. Mogul, R. Moskowitz, G. Minshall, T. Li, C. Villamizar, S. Corbato, and countless others. Finally, the authors thank the anonymous reviewers for their efforts in improving this work.

#### REFERENCES

- [1] F. Baker, "Requirements for IP Version 4 Routers,", RFC 1812, 1995.
- [2] G. Banga, P. Druschel, and J. Mogul, "Resource containers: A new facility for resource management in server systems," in *Proc. USENIX/ACM Symp. Operating System Design and Implementation*, Feb. 1999, pp. 45–58.
- [3] S. M. Bellovin, "Security problems in the TCP/IP protocol suite," *Comput. Commun. Rev.*, vol. 19, no. 2, pp. 32–48, Apr. 1989.
- [4] S. M. Bellovin, "ICMP traceback messages,", Internet Draft: draft-bellovin-itrace-00.txt, 2000.
- [5] R. Braden, "Requirements for internet hosts—Communication layers,", RFC 1122, 1989.

- [6] H. Burch and B. Cheswick, "Tracing anonymous packets to their approximate source," in *Proc. 2000 USENIX LISA Conf.*, Dec. 2000, pp. 319–327.
- [7] R. L. Carter and M. E. Crovella, "Dynamic server selection using dynamic path characterization in wide-area networks," in *Proc. IEEE IN-FOCOM*, vol. 3, Apr. 1997, pp. 1014–1021.
- [8] Internet Mapping Project, B. Cheswick and H. Burch. (2000). [Online]. Available: http://cm.bell-labs.com/who/ches/map/index.html
- [9] "Configuring TCP intercept (prevent denial-of-service attacks), Cisco IOS Documentation," Cisco Systems, 1997.
- [10] K. Claffy and S. McCreary, private communication, Jan. 2000.
- [11] CERT Advisory CA-96.26 Denial-of-service attack via pings (1996, Dec.). [Online]. Available: http://www.cert.org/advisories/CA-96.26. ping.html
- [12] CERT Advisory CA-97.28 IP Denial-of-service attacks (1997, Dec.).
  [Online]. Available: http://www.cert.org/advisories/CA-97.28.smurf. html
- [13] CERT Advisory CA-98.01 "smurf" IP Denial-of-service attacks (1998, Jan.). [Online]. Available: http://www.cert.org/advisories/CA-97.01. smurf.html
- [14] CERT Advisory CA-2000–01 Denial-of-service developments (2000, Jan.). [Online]. Available: http://www.cert.org/advisories/CA-2000-01. html
- [15] CERT Incident Note IN-2000–04 Denial-of-service attacks using nameservers (2000, Apr.). [Online]. Available: http://www.cert.org/incident\_notes/IN-200-04.html
- [16] Computer Security Institute and Federal Bureau of Investigation, "1999 CSI/FBI Computer Crime and Security Survey," Computer Security Institute publication, Mar. 1999.
- [17] Skitter analysis (2000). [Online]. Available: http://www.caida.org/ Tools/Skitter/Summary/
- [18] D. Dean, M. Franklin, and A. Stubblefield, "An algebraic approach to IP traceback," in *Proc. 2001 Network and Distributed System Security Symp.*, Feb. 2001.
- [19] S. Deering, "Internet Protocol, Version 6 IPv6,", RFC 2460, 1998.
- [20] W. Feller, An Introduction to Probability Theory and Its Applications, 2nd ed. New York: Wiley, 1966, vol. 1.
- [21] P. Ferguson and D. Senie, "Network ingress filtering: Defeating denial-of-service attacks which employ IP source address spoofing,", RFC 2827, 2000.
- [22] J. Glave. (1998) Smurfing cripples ISPs. Wired Technology News. [Online]. Available: http://www.wired.com/news/news/technology/story/ 9506.html
- [23] I. Goldberg and A. Shostack, Freedom Network 1.0 Architecture and Protocols. Zero-Knowledge Systems White Paper, Nov. 1999.
- [24] R. Govindan and H. Tangmunarunkit, "Heuristics for Internet map discovery," in *Proc. IEEE INFOCOM*, vol. 3, Mar. 2000, pp. 1371–1380.
- [25] L. T. Heberlein and M. Bishop, "Attack class: Address spoofing," in Natl. Information Systems Security Conf., Oct. 1996, pp. 371–378.
- [26] J. D. Howard, "An analysis of security incidents on the Internet," Ph.D. dissertation, Carnegie Mellon Univ., Pittsburgh, PA, 1998.
- [27] P. Karn and W. Simpson, "Photuris: Session-key management protocol,", RFC 2522, 1999.
- [28] C. Kent and J. Mogul, "Fragmentation considered harmful," in *Proc.* ACM SIGCOMM Conf., Aug. 1987, pp. 390–401.
- [29] S. Kent and R. Atkinson, "Security architecture for the Internet protocol,", RFC 2401, 1998.
- [30] C. Meadows, "A Formal Framework and Evaluation Method for Network Denial of Service," in *Proc. IEEE Computer Security Foundations Workshop*, June 1999, pp. 4–13.
- [31] J. Mogul and S. Deering, "Path MTU discovery,", RFC 1191, 1990.
- [32] R. T. Morris, "A weakness in the 4.2BSD Unix TCP/IP Software," AT&T Bell Labs, Tech. Rep. Comput. Sci. 117, 1985.
- [33] V. Paxson, "End-to-end routing behavior in the Internet," *IEEE/ACM Trans. Networking*, vol. 5, pp. 601–615, Oct. 1997.
- [34] C. Perkins, "IP mobility support,", RFC 2002, 1996.
- [35] J. Postel, "Internet protocol,", RFC 791, 1981.
- [36] G. Reed, P. F. Syverson, and D. M. Goldschlag, "Anonymous connections and onion routing," *IEEE J. Select. Areas Commun.*, vol. 16, pp. 482–494, May 1998.
- [37] MPLS label stack encoding, Jan. 2001.
- [38] G. Sager, "Security Fun with OCxmon and cflowd," presented at the Internet 2 Working Group, Nov. 1998.

- [39] D. Song and A. Perrig, "Advanced and authenticated marking schemes for IP traceback," in *Proc. IEEE INFOCOM*, vol. 2, Apr. 2001, pp. 878–886.
- [40] O. Spatscheck and L. Peterson, "Defending against denial-of-service attacks in Scout," in Proc. USENIX/ACM Symp. Operating System Design and Implementation, Feb. 1999, pp. 59–72.
- [41] S. Staniford-Chen and L. T. Heberlein, "Holding intruders accountable on the Internet," in *Proc. IEEE Symp. Security and Privacy*, May 1995, pp. 39–49.
- [42] I. Stoica and H. Zhang, "Providing guaranteed services without per-flow management," in *Proc. ACM SIGCOMM*, Aug. 1999, pp. 81–94.
- [43] R. Stone, "CenterTrack: An IP overlay network for tracking DoS floods," in *Proc. 2000 USENIX Security Symp.*, July 2000, pp. 199–212.
- [44] W. Theilmann and K. Rothermel, "Dynamic distance maps of the Internet," in *Proc. IEEE INFOCOM*, vol. 1, Mar. 2000, pp. 275–284.
- [45] C. Villamizar, private communication, Feb. 2000.
- [46] M. Vivo, E. Carrasco, G. Isern, and G. O. Vivo, "A review of port scanning techniques," *Comput. Commun. Rev.*, vol. 29, no. 2, pp. 41–48, Apr. 1999.
- [47] Y. Zhang and V. Paxson, "Stepping stone detection," in *Proc. USENIX Security Symp.*, July 2000, pp. 171–183.

Stefan Savage received the Ph.D. degree from the University of Washington, Seattle.

He is currently an Assistant Professor at the University of California at San Diego (UCSD). His previous research has spanned a number of areas, including real-time systems, OS kernel structure, disk arrays, and concurrency control. He has focused solely on problems in wide-area networking for the last several years.

**David Wetherall** (M'89) received the Ph.D. degree in computer science from the Massachusetts Institute of Technology (MIT), Cambridge, in 1998.

He is currently a Member of the Faculty of Computer Science and Engineering at the University of Washington (UW), Seattle. He has conducted computer systems research for ten years and authored papers on topics ranging from distributed systems to internetworking to programming languages. His thesis research helped to pioneer the field of Active Networks, in which flexible network infrastructures are used to enable rapid service innovation.

Anna Karlin received the Ph.D. degree in computer science from Stanford University, Stanford, CA, in 1987.

After a one and half year postdoctoral position at Princeton University, Princeton, NJ, she joined Digital Equipment Corporations Systems Research Center as a Research Scientist. In 1994, she was a Visiting Professor with the University of Washington, Seattle, where she became a Member of the Faculty in 1996. She has been a full Professor since 1998. Her research is concerned with the design and analysis of algorithms, with a primary focus on probabilistic and online algorithms. She is a member of the National Research Councils Computer Science and Telecommunications Board, and is on the editorial board for *SIAM Journal on Computing*.

**Tom Anderson** is currently an Associate Professor of computer science and engineering at the University of Washington, Seattle. His research has spanned a wide spectrum of topics, from multiprocessor scheduling, to high-speed switch design, to tools for software engineering, to scalable and fault tolerant cluster software, to merged logic and DRAM chip designs, to his most recent focus on Internet reliability and security. He has co-authored a dozen award papers at top conferences.

Dr. Anderson has received a National Science Foundation Presidential Faculty Fellowship and a Sloan Research Fellowship.