

# Kill-Bots: Surviving DDoS Attacks That Mimic Legitimate Browsing

Srikanth Kandula

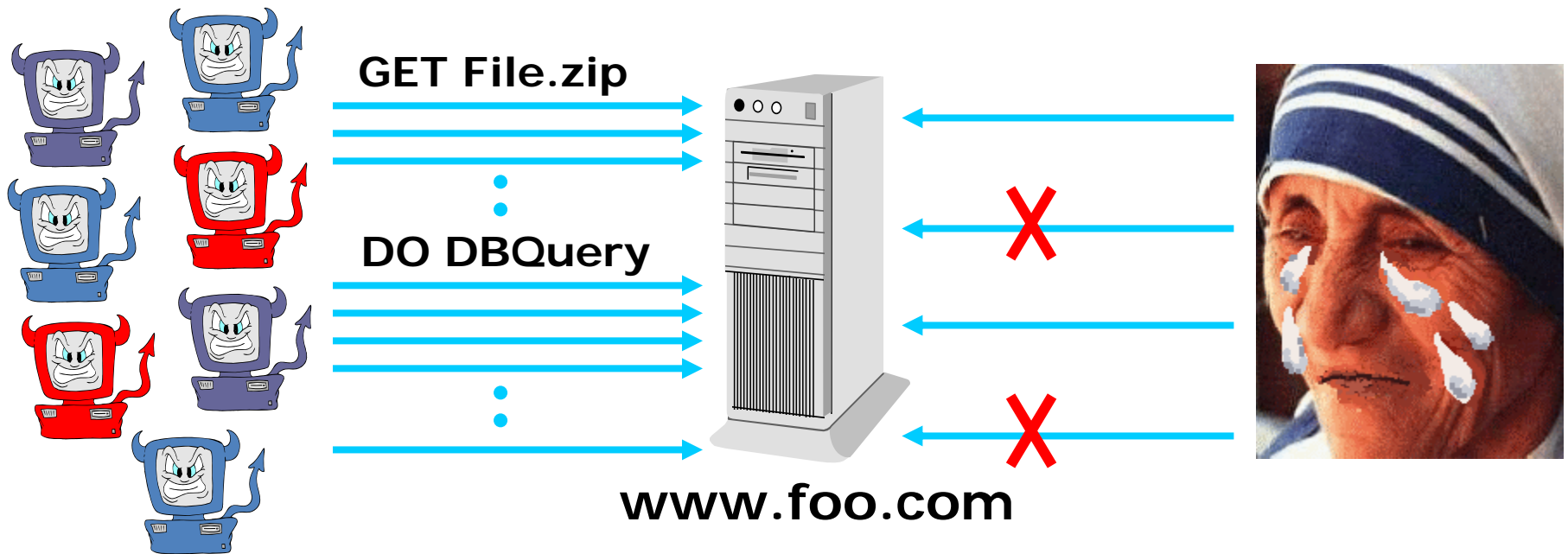
Dina Katabi, Matthias Jacob, and Arthur Berger



CyberSlam = DDoS that Mimics  
Legitimate Browsing

# CyberSlam

20,000+ zombies issue requests that mimic legitimate browsing



**Requests Look Legitimate  $\Rightarrow$  Standard filters don't help**

# CyberSlam Attacks Happen!

- Instances of CyberSlam
  - First FBI DDoS Case – Hired professionals hit competitor
  - Mafia extorts online gaming sites ...
  - Code RED Worm
- Why CyberSlam?
  - Avoid detection by NIDS & firewalls
  - High pay-off by targeting expensive resources
    - E.g., CPU, DB, Disk, processes, sockets
  - Large botnets are available

# Threat Model

- In scope
  - Attacks on higher layer bottlenecks, e.g., CPU, Memory, Database, Disk, processes, ...
  - Attacks that fool the server to congest its uplink bandwidth
  - Mutating attacks
- Outside the scope
  - Flooding server's downlink (prior work)
  - Live-lock in the device driver

# Tentative Solutions

- Filter big resource consumers?
- Passwords?
- Computational puzzles?

→ No big consumers;  
Commodity OS do not support fine-grained resource accounting

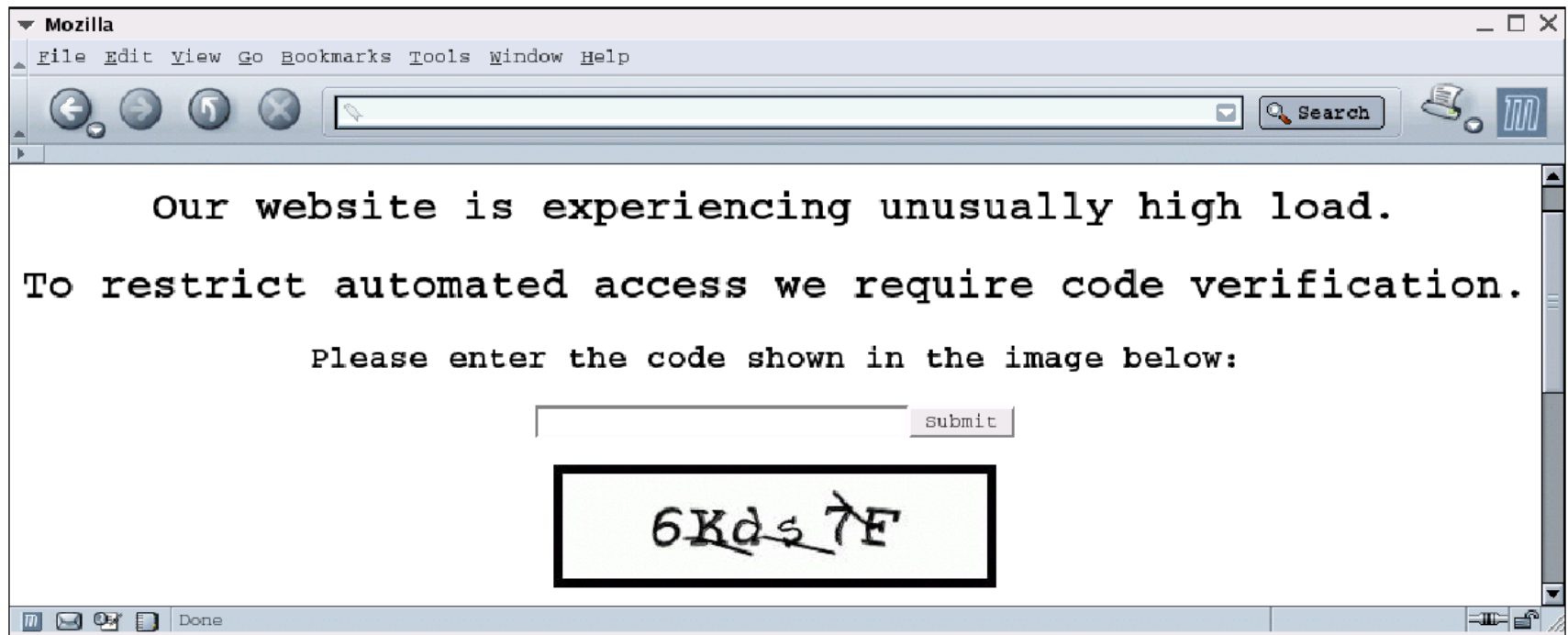
→ Might not exist,  
expensive to check

→ Computation is abundant in a botnet

????

## Partial Solution:

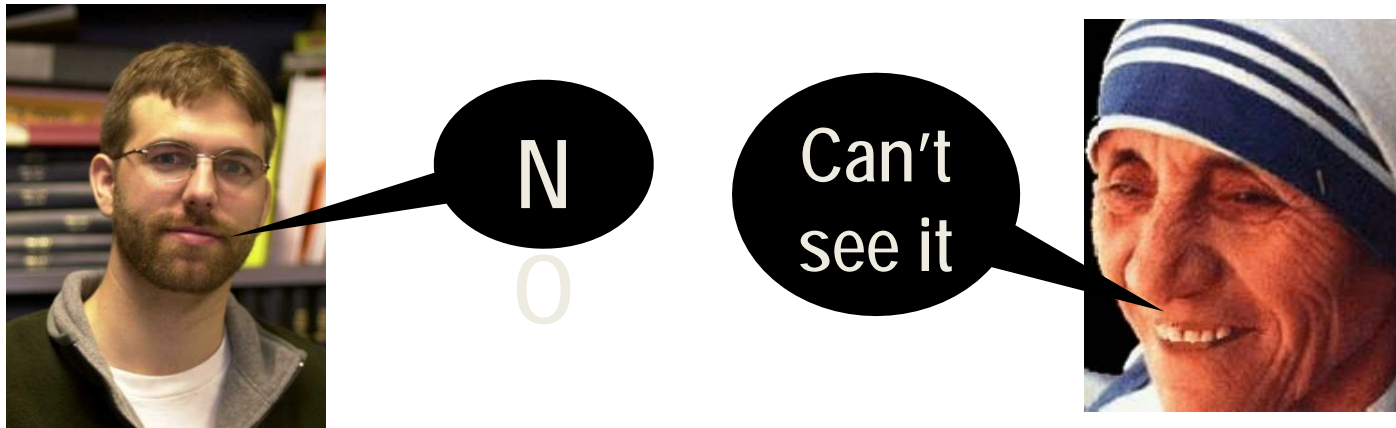
Reverse Turing Test (e.g., CAPTCHAs) to distinguish humans from zombies



But...

### 3 Problems with CAPTCHA Authentication

- (1) **DDoS the authentication** mechanism (connect to server, force context-switches, hog sockets etc.)
- (2) **Bias** against users who can't or won't answer CAPTCHAs



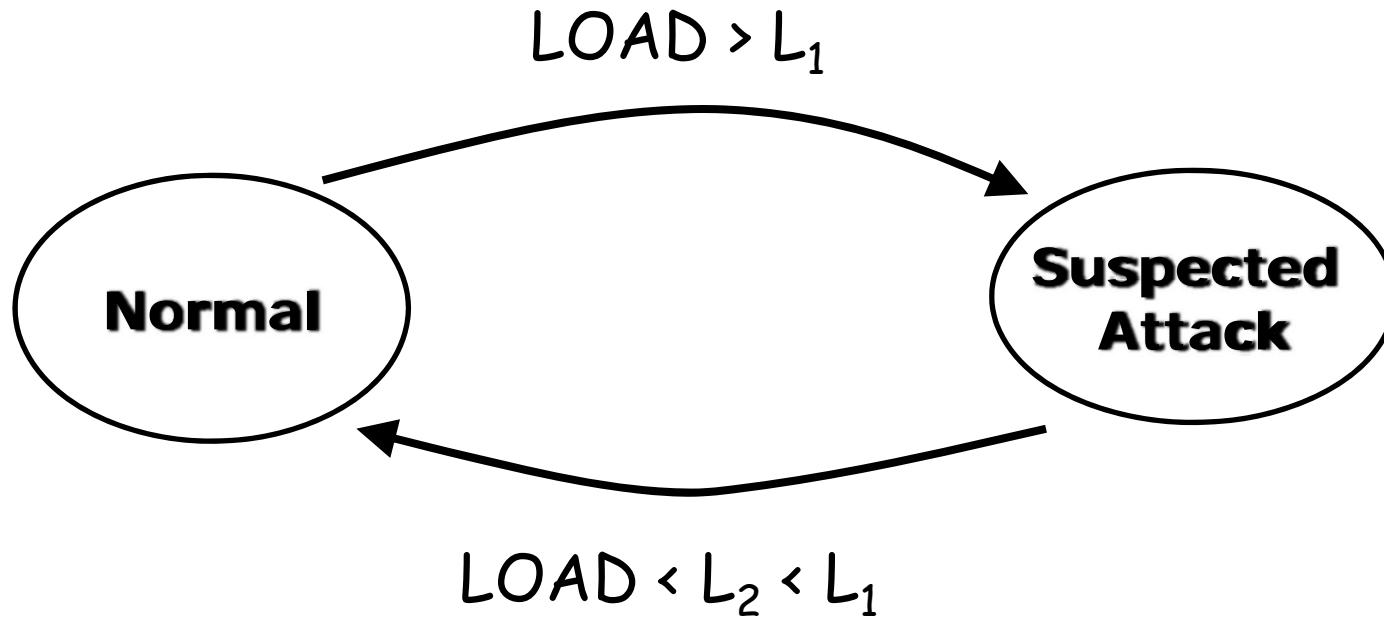
- (3) How to **divide resources** between service and authentication as to **maximize system goodput**?



# Kill-Bots' Contributions

- First to protect against CyberSlam
- Solves problems with CAPTCHAs:
  - Cheap stateless authentication
  - Serves legit. users who don't answer CAPTCHAs
  - Optimal balance between authentication & service
- Improves performance during Flash Crowds
- Order of magnitude improvement in goodput & response time

Kill-Bots is a kernel extension for web servers

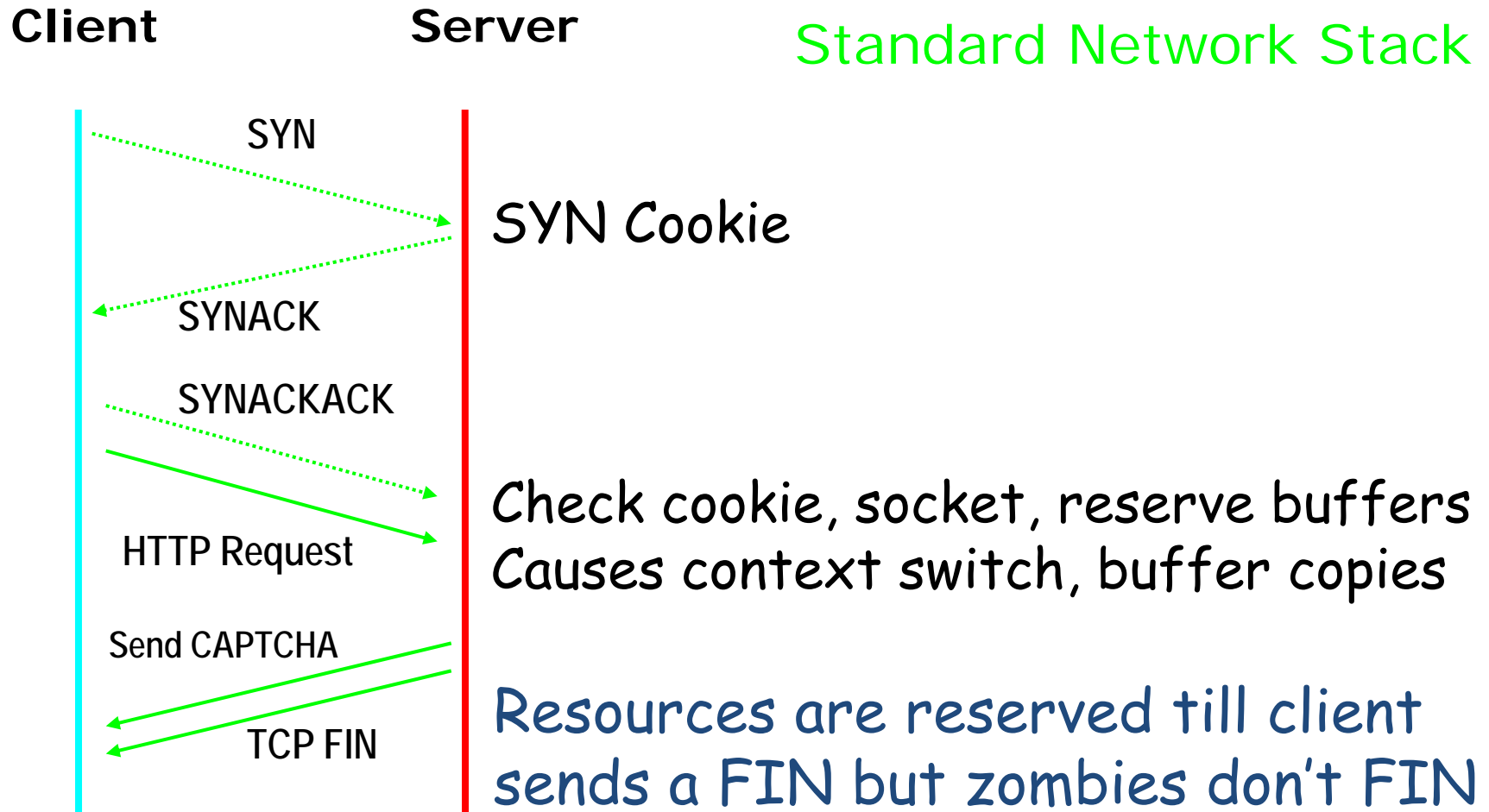


No Overhead

New Clients are  
authenticated once  
and given HTTP Cookie

## **Problem 1:** Authentication vulnerable to DDoS

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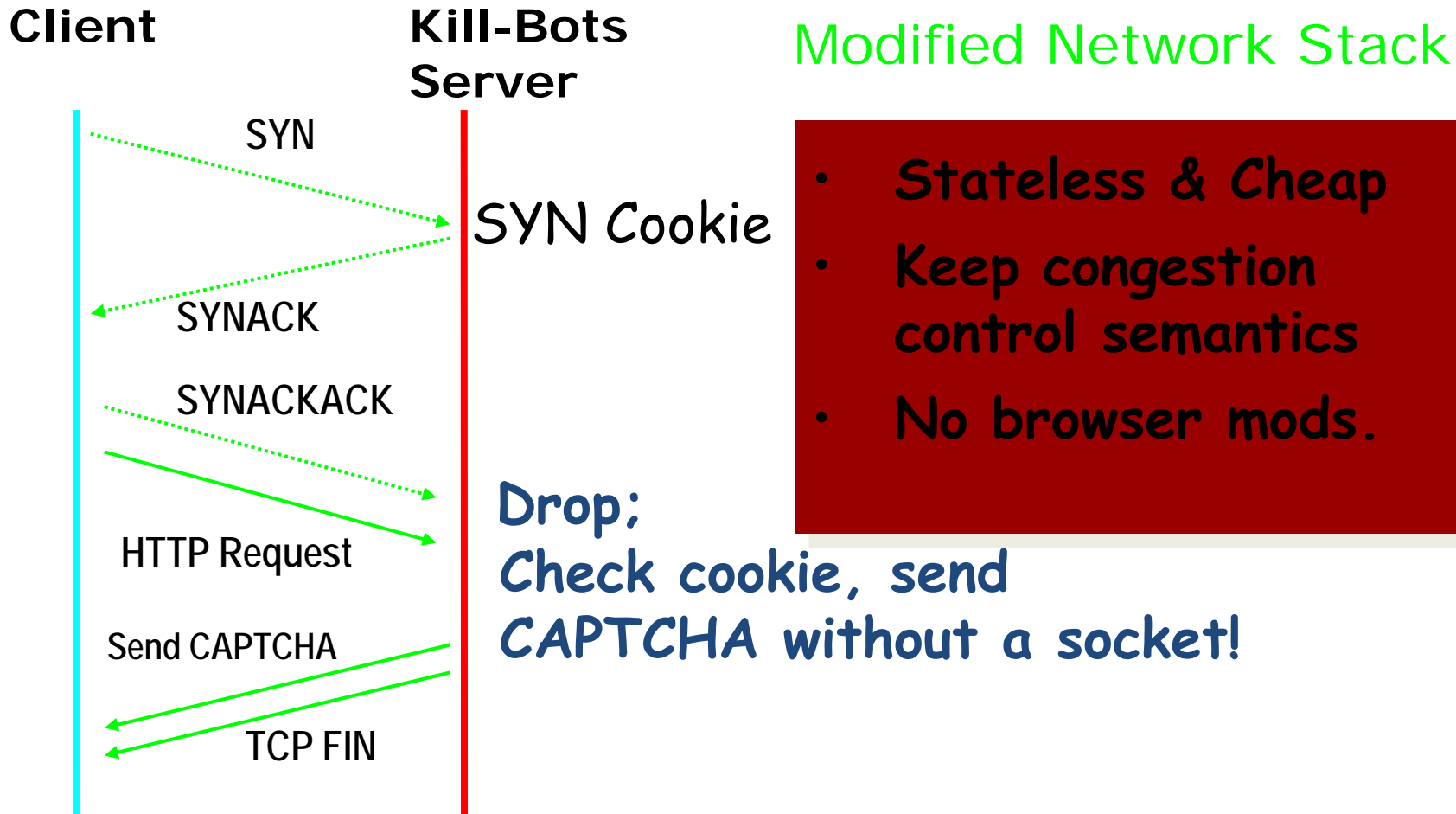


**Problem 1:** Authentication vulnerable to DDoS

**Solution:** Modify network stack to issue CAPTCHAs without state

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Problem 2: Legit. Users who don't answer CAPTCHA

Solution: Use reaction to CAPTCHA

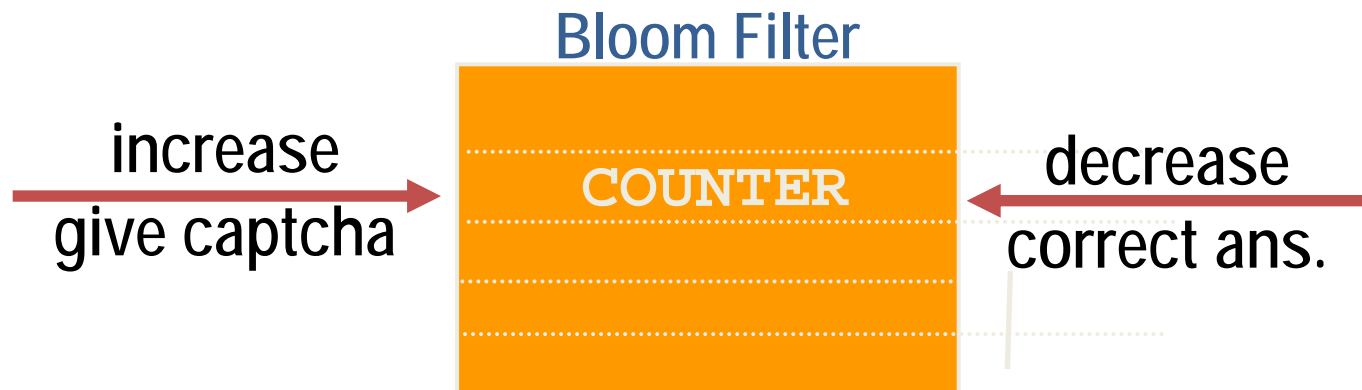
### Humans

- (1) Answer CAPTCHA
- (2) Reload; if doesn't work, give up

### Zombies

Can't answer CAPTCHA, but have to bombard the server with requests

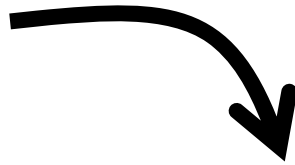
- Count the unanswered CAPTCHAs per IP, and drop if more than  $T$ ; Cheap with a Bloom Filter



## Stage 1:

- **CAPTCHA Authentication**
- Learn IP addresses of zombies using Bloom filter

**Bloom Learns  
All Zombie IPs**



## Stage 2:

- Use only Bloom filter for Authentication
- **No CAPTCHAs**

Users who don't answer *CAPTCHAs* can access the server despite the attack in Stage 2



Problem 3:

To Authenticate or To Serve?

### Problem 3: To Authenticate or To Serve?

- Authenticate all new arrivals
  - can't serve all authenticated clients
- Authenticate very few arrivals
  - too few legitimate users are authenticated

### Solution:

- Authenticate new clients with prob.  $\alpha$  (drop others)
  - A form of admission control with 2 arrival types

But what  $\alpha$  maximizes goodput?

# Analysis

Modeled system using Queuing Theory

Found Optimal  $\alpha^*$  (proof in paper)

But  $\alpha^*$  depends on many unknown parameters

- attack rate
- mean service time
- mean session size
- legitimate request rate, etc...

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$$\frac{\alpha_{90\%}}{\alpha_{current}} = \frac{0.9}{1 - idle_{current}}$$

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$$\alpha_{90\%} - \alpha_{current} = \alpha_{current} \left( \frac{idle_{current} - 0.1}{1 - idle_{current}} \right)$$

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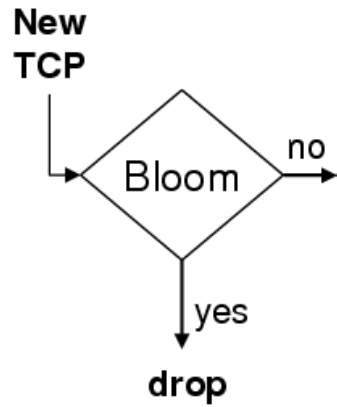
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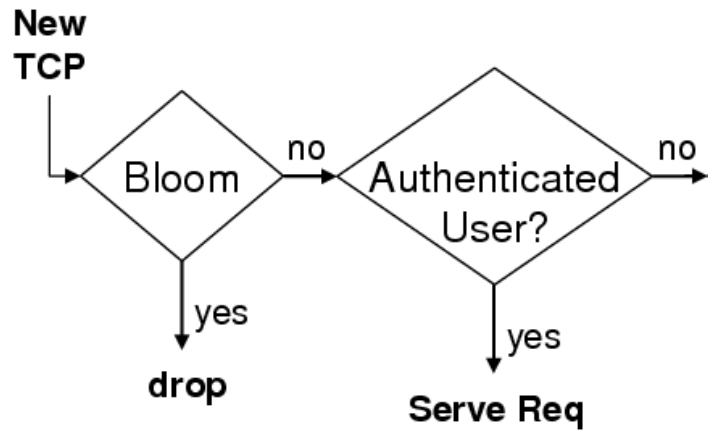
$$\Delta\alpha = \frac{1}{8} \alpha_{current} \left( \frac{idle_{current} - 0.1}{1 - idle_{current}} \right)$$

# Tying it Together

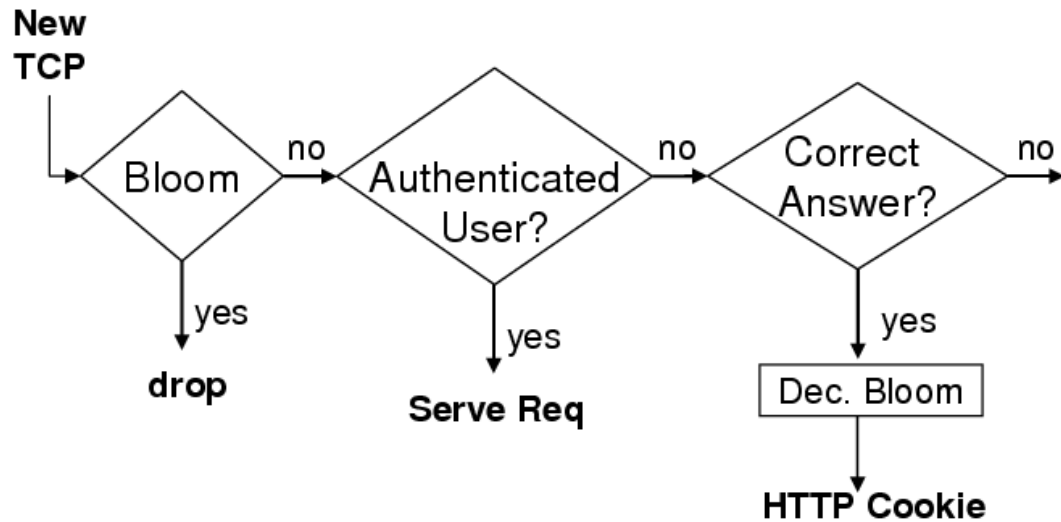




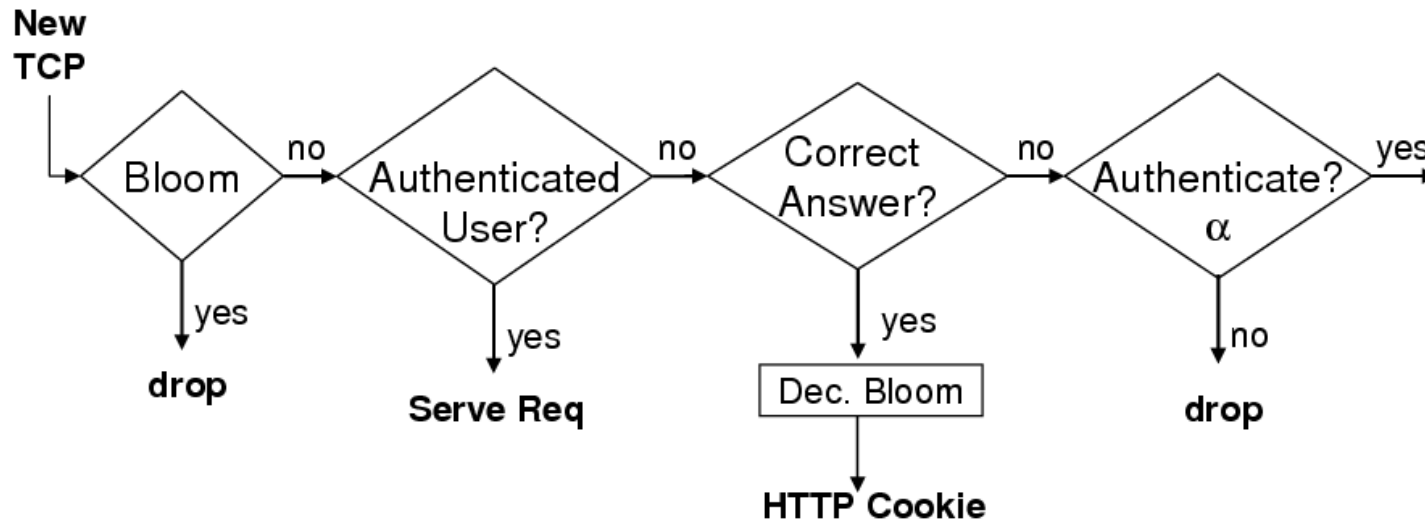
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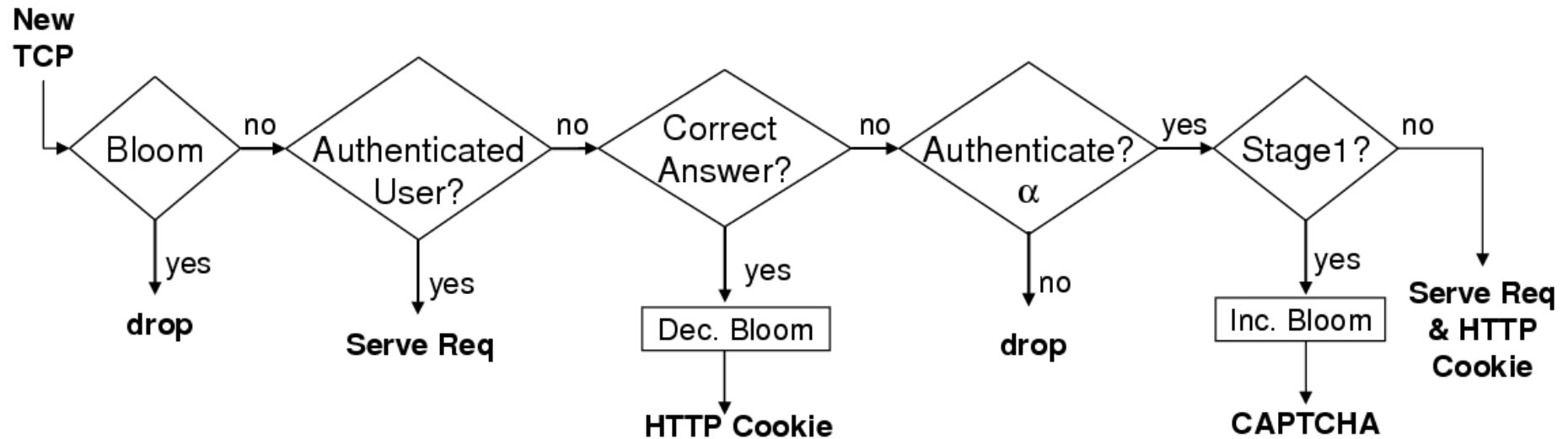
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# Recap: Kill-Bots addresses CyberSlam

## Problem

- DDoS the authentication
- Serve legitimate users who don't answer CAPTCHAs
- Divide resources between authentication & service

## Solution

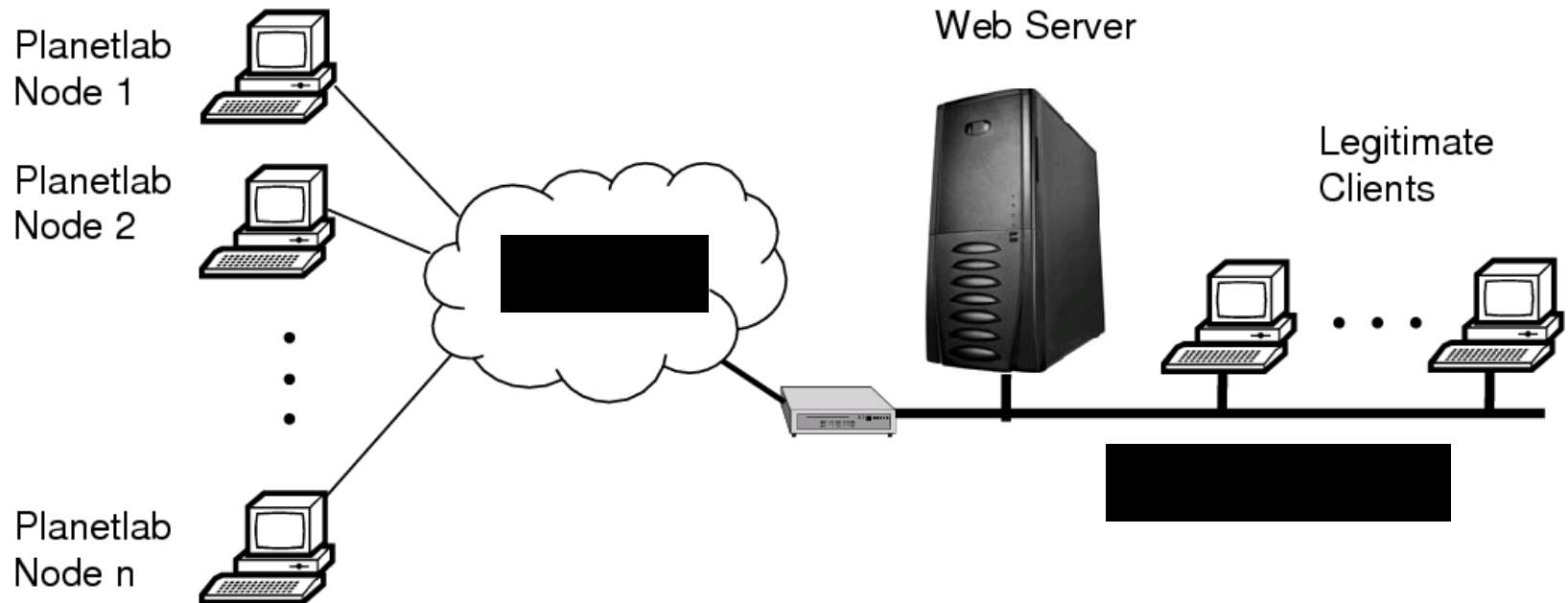
- Send CAPTCHAs cheaply without sockets
- Use reaction to CAPTCHA to identify zombies
- Adaptive authentication as admission control

# Attacks & Defenses

- Replay Attacks?
  - Don't work. Limit #connections per cookie
- Spoof IP, cause Bloom filter to block
  - Doesn't happen. SYN cookie before updating Bloom
- Breaking the CAPTCHA?
  - Kill-bots can use any Reverse Turing Test

Performance

# Wide-area Evaluation Using PlanetLab



- Legit. users are driven from CSAIL Web traces
- >25,000 attackers on PlanetLab request random pages
- 60% of legitimate users answer CAPTCHAs

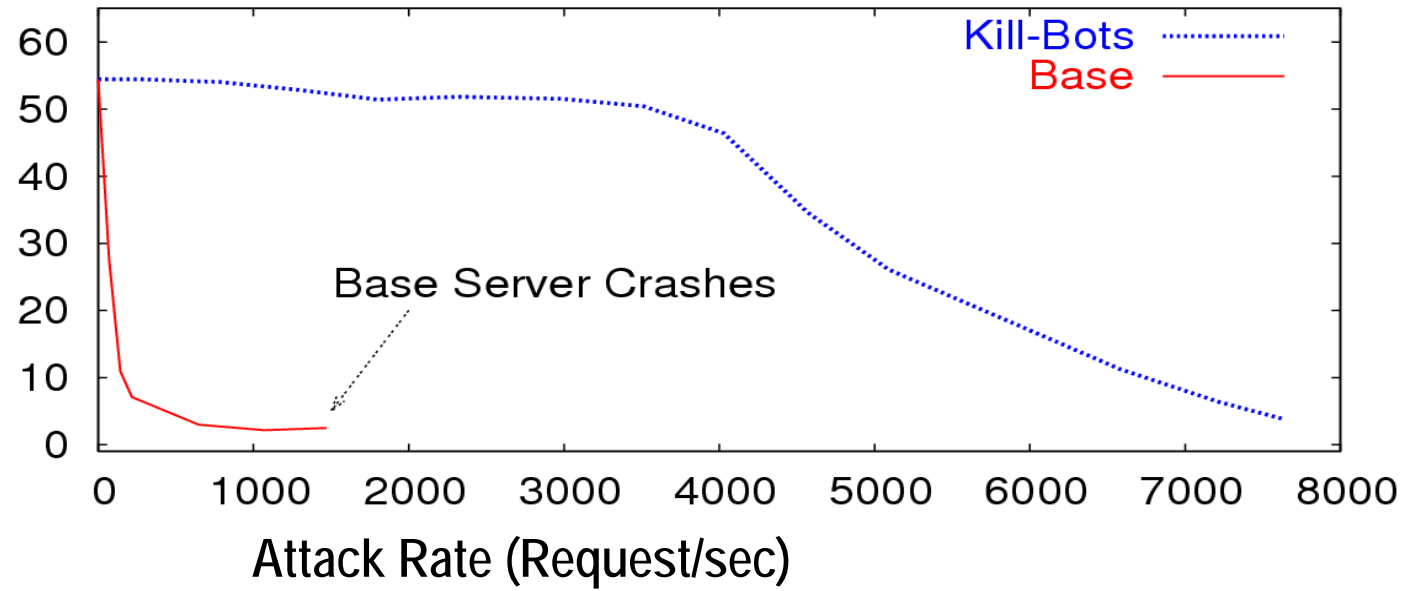


# Metrics

- Goodput (of Legitimate Users)
- Response time (of Legitimate Users)
- Maximum survivable attack rate

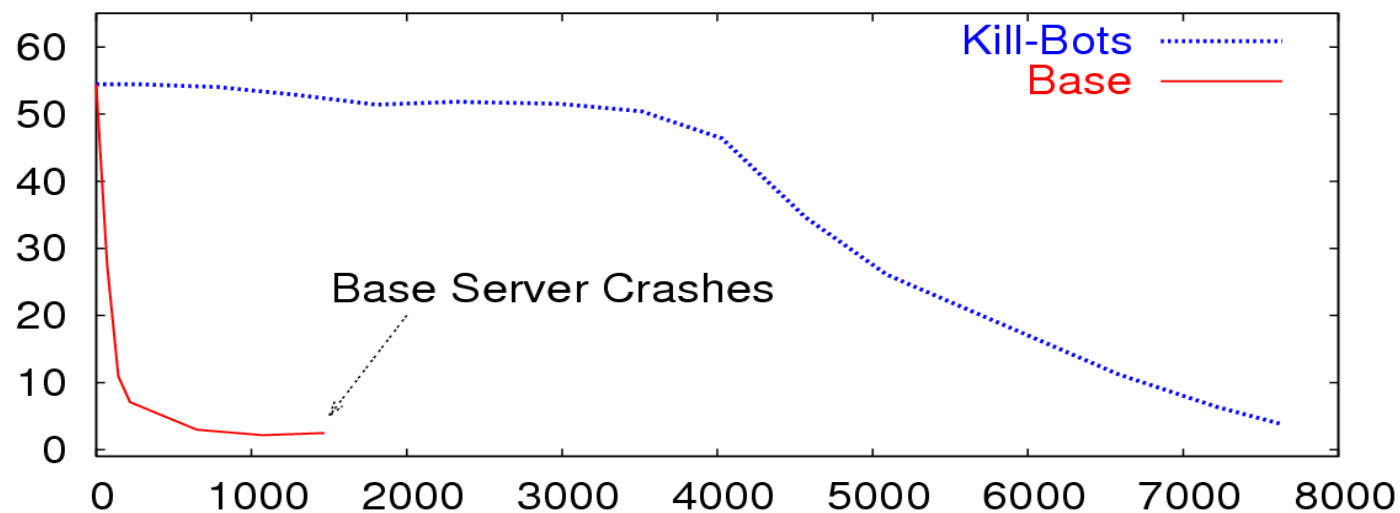
# Kill-Bots under DDoS

Goodput of Legit. (Mb/s)

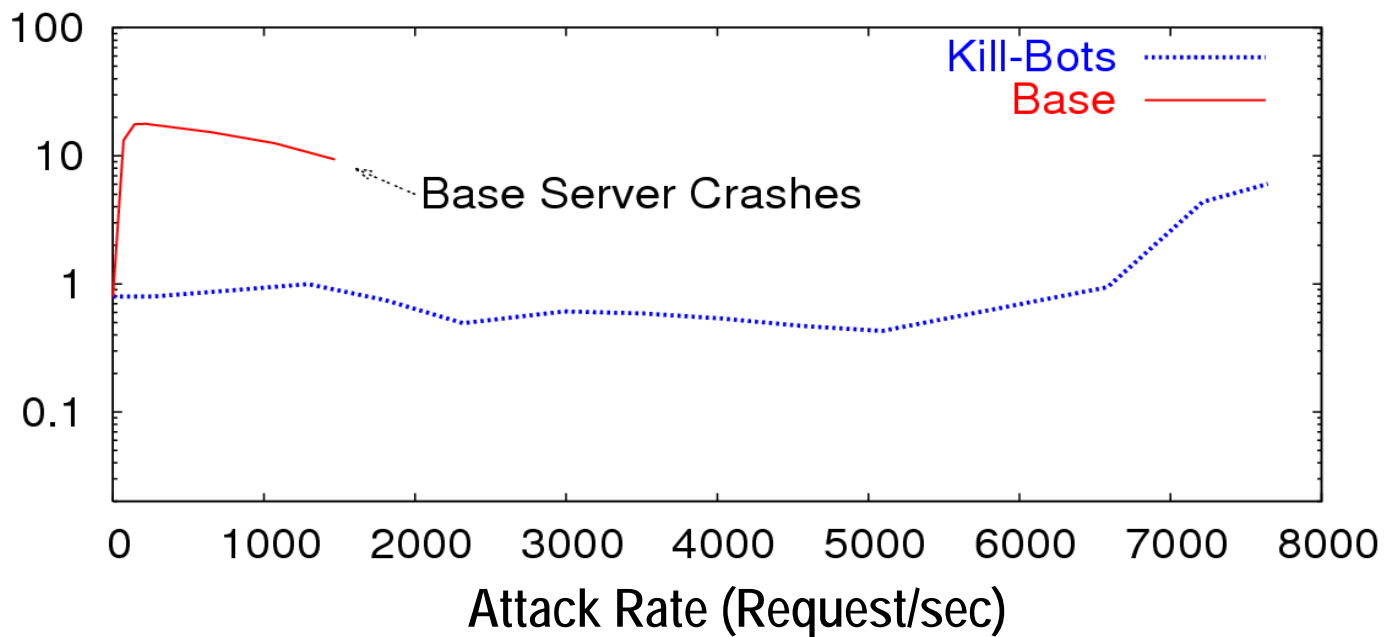


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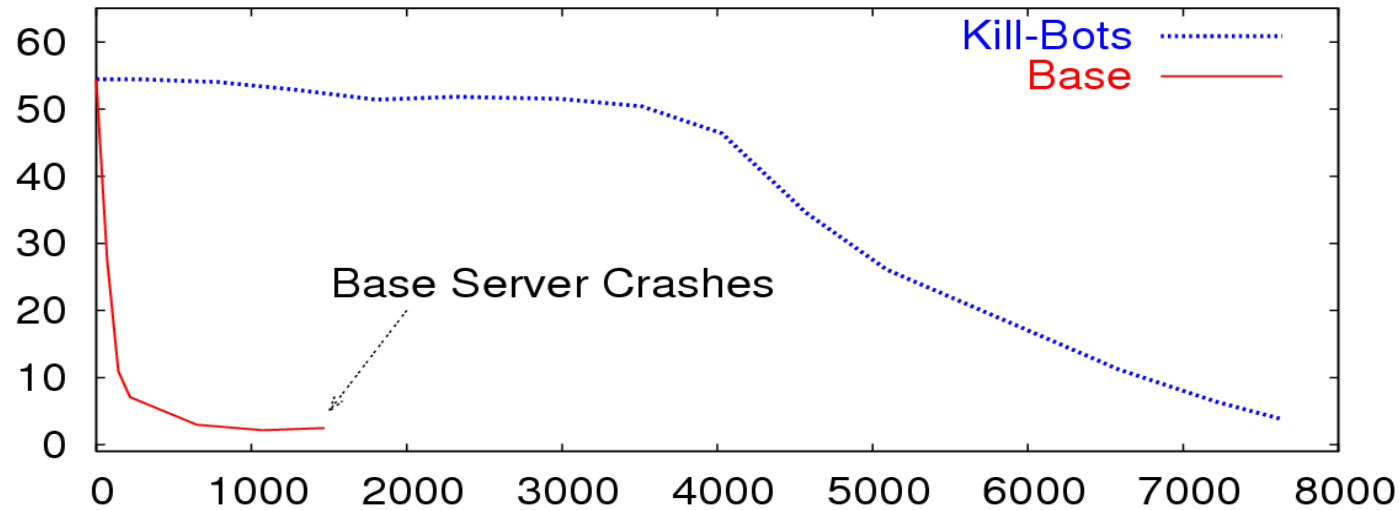


Response Time (sec)

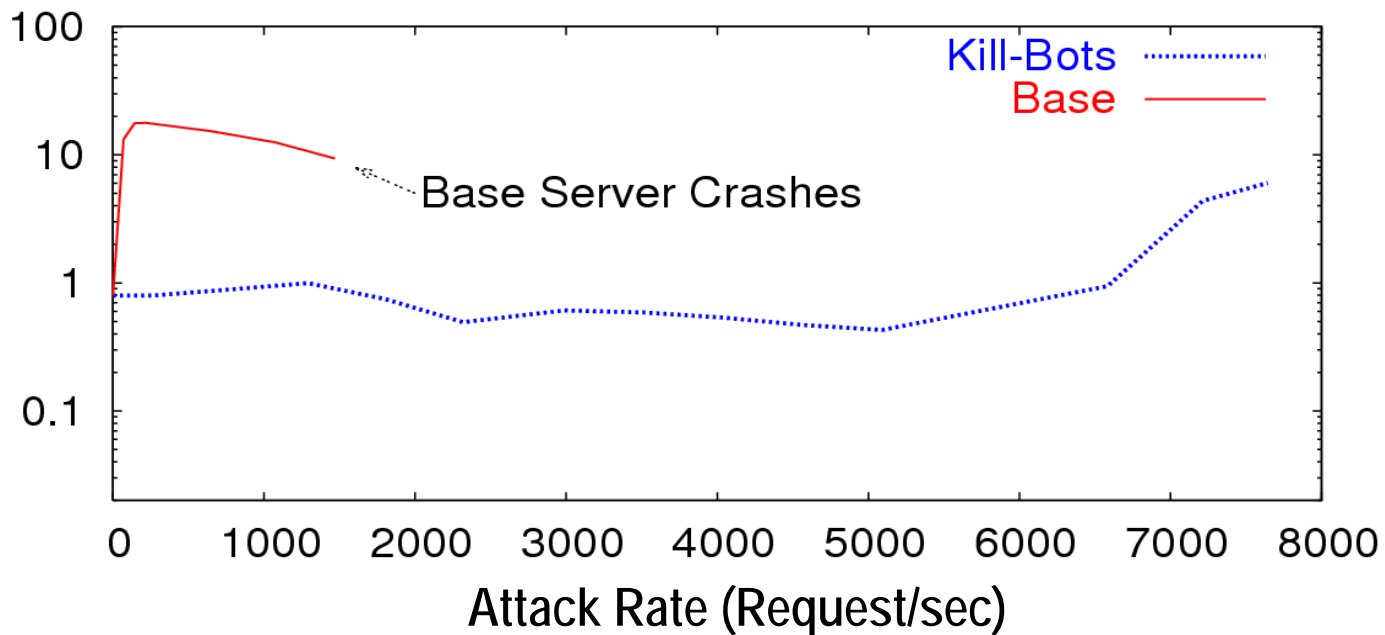


# 5-10 times better Goodput and Response Time

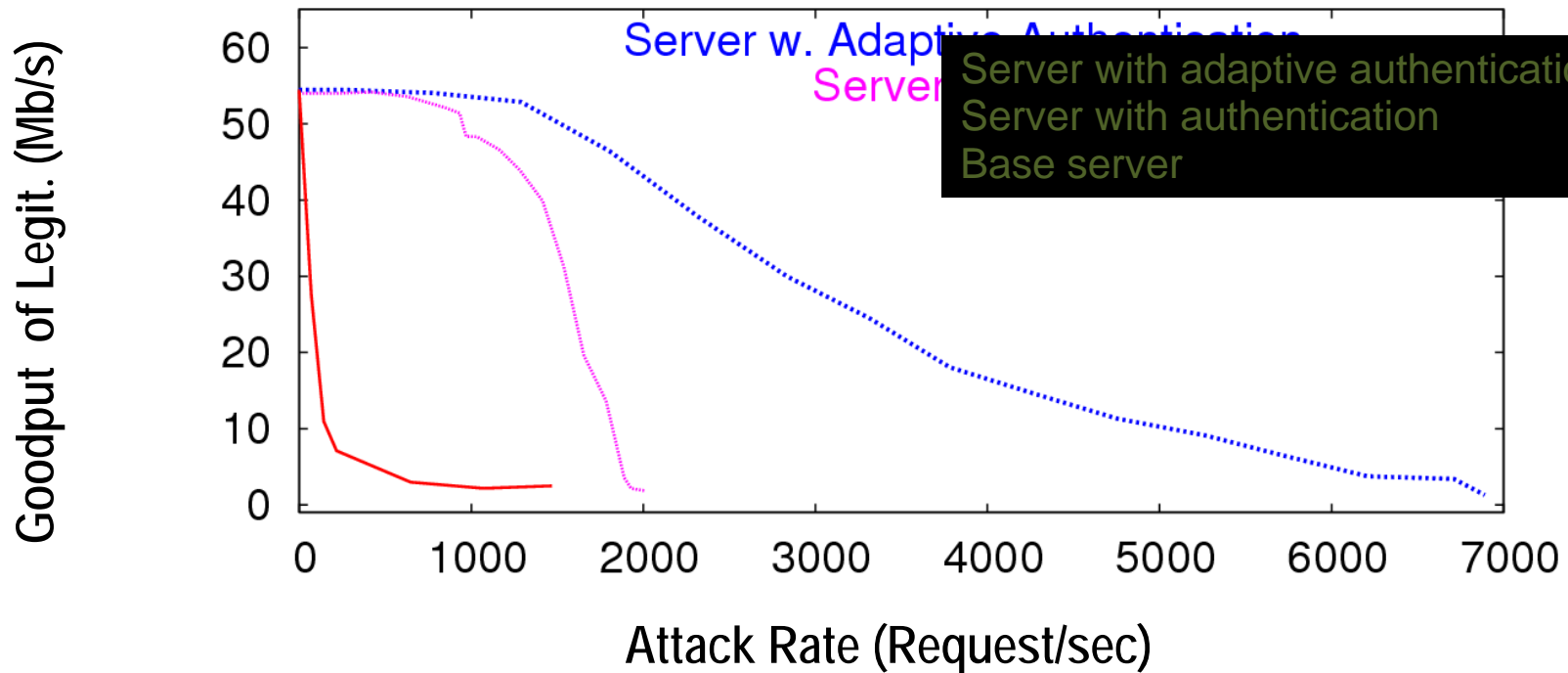
Goodput of Legit. (Mb/s)



Response Time (sec)

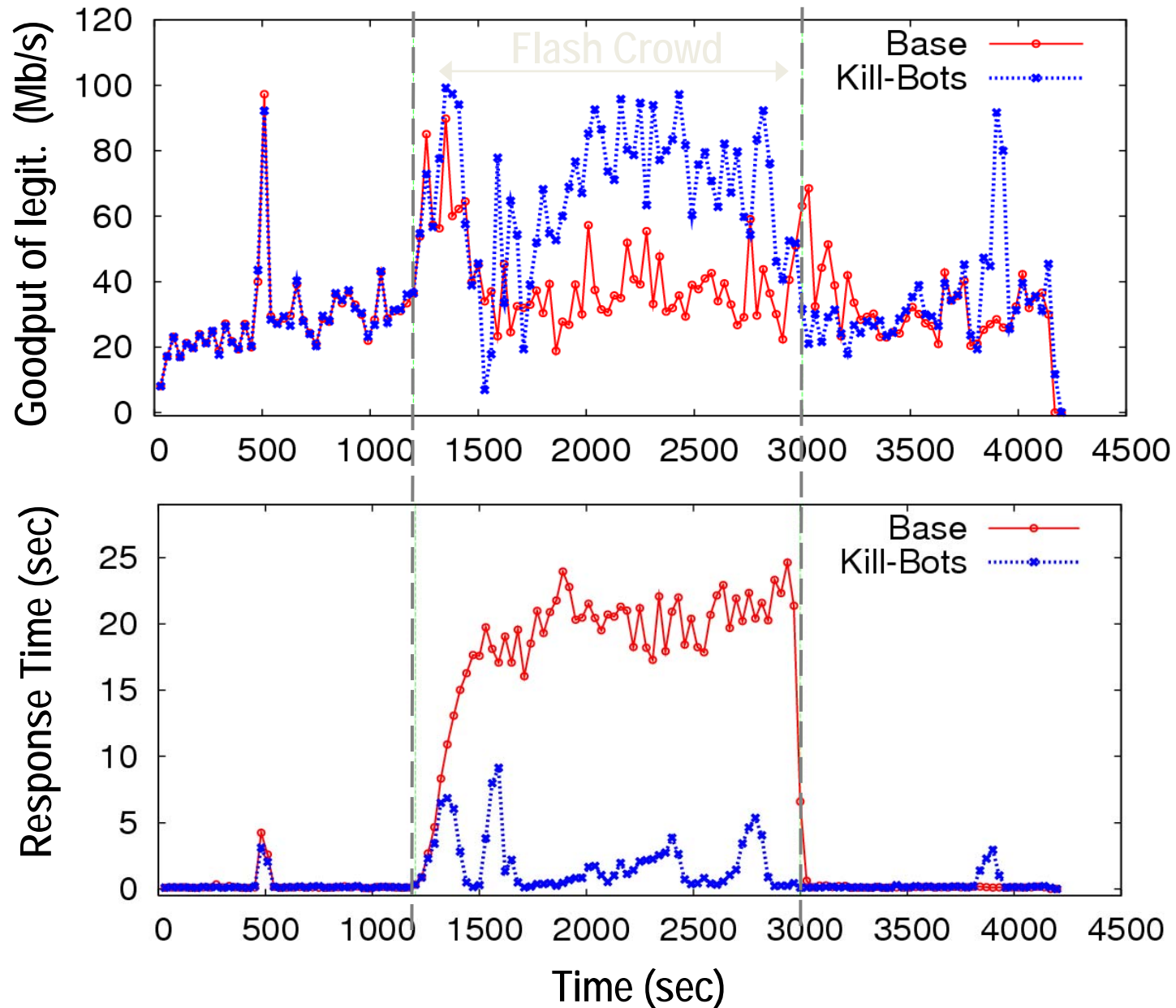


# Why Adapt the Authentication Probability?

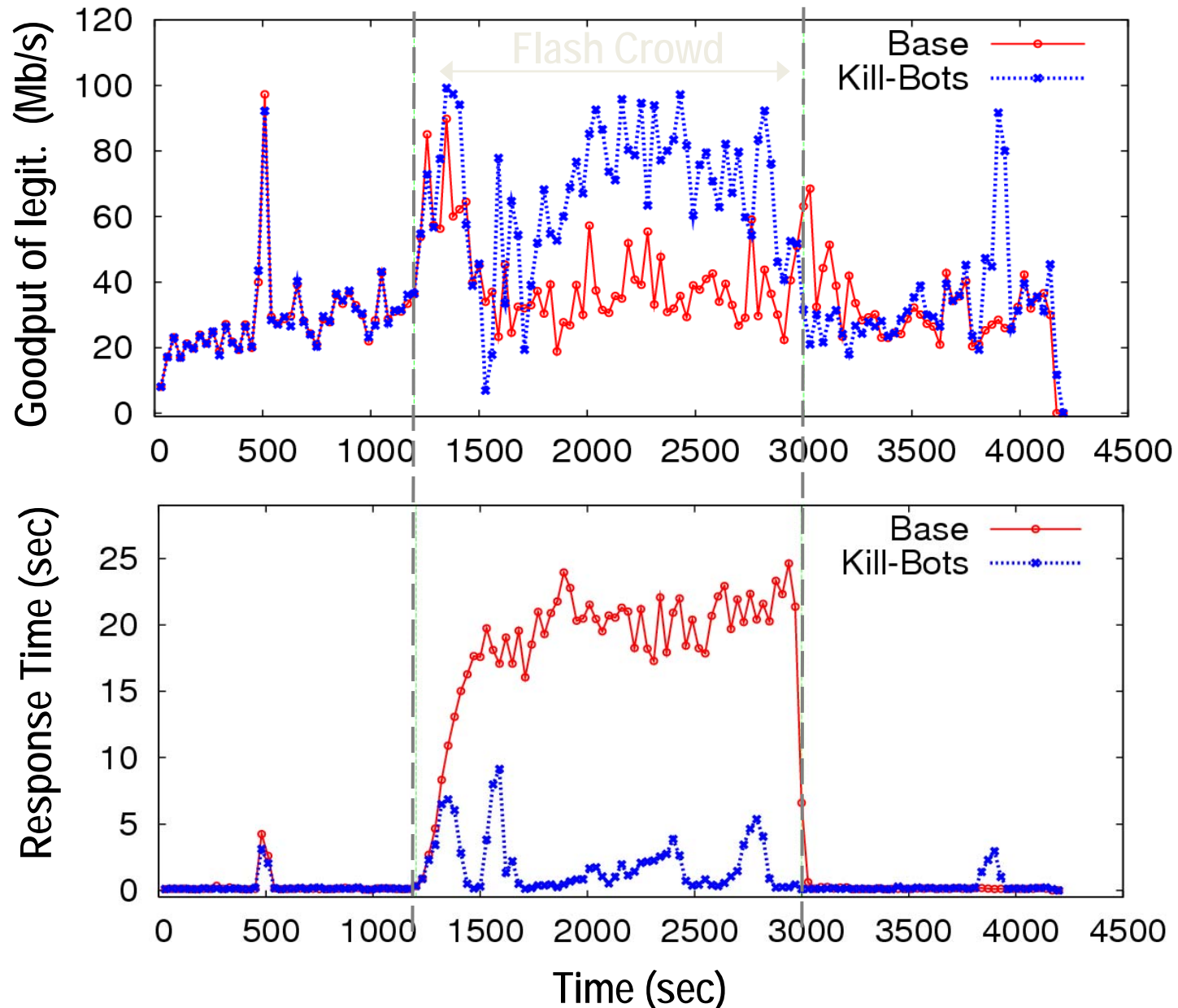


Adaptive  $\alpha$  is much better than authenticating every new user

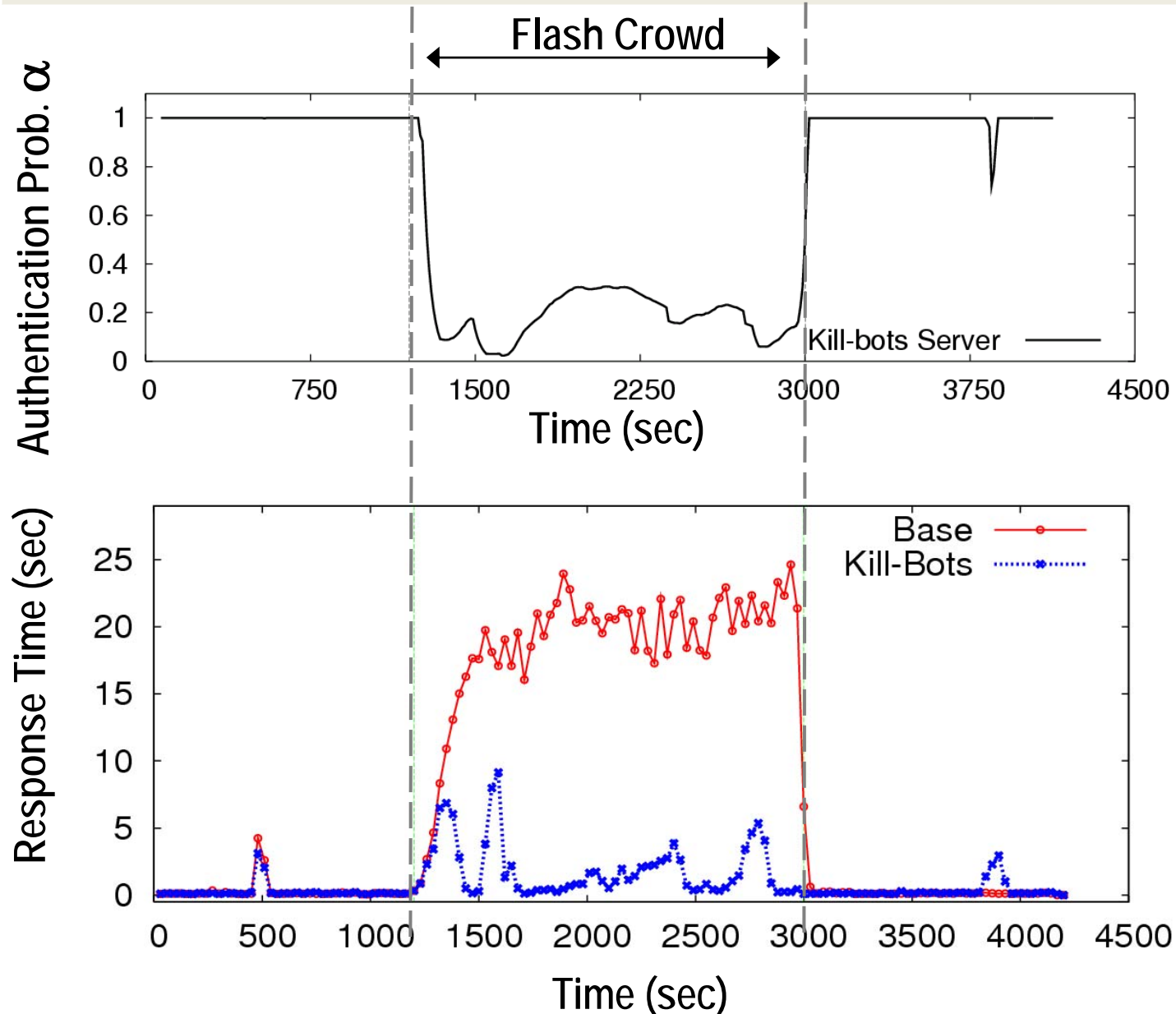
# Kill-Bots under Flash Crowd



# Orders of magnitude better Response Time



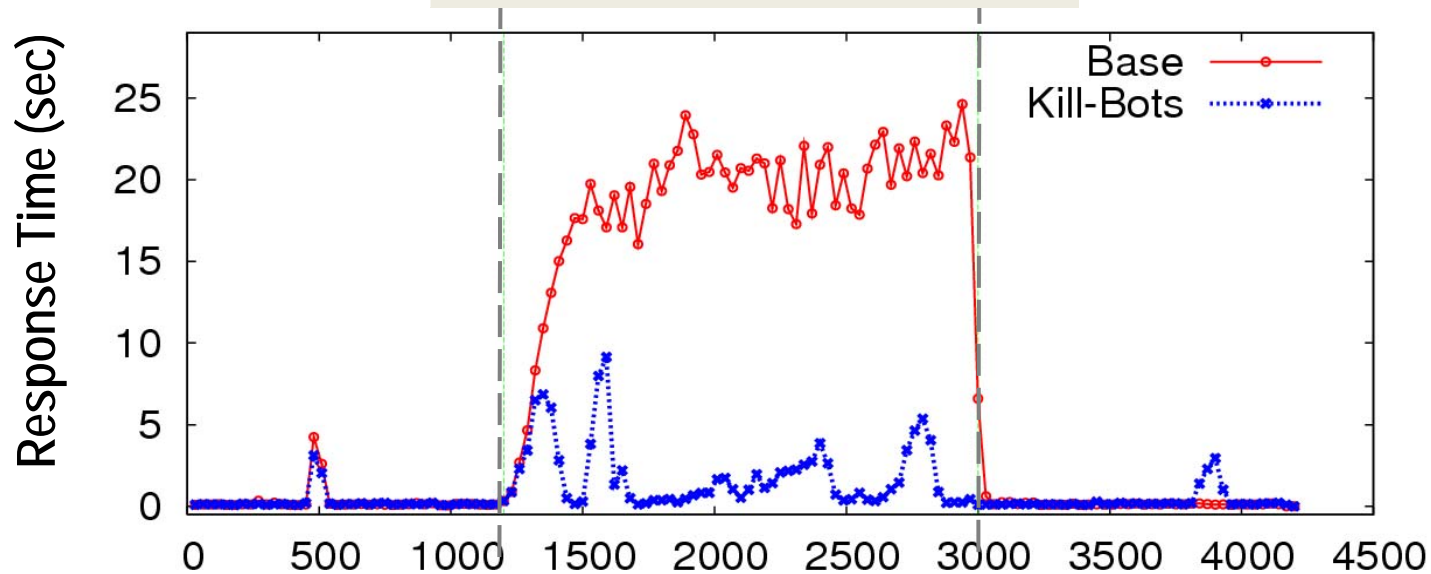
# Adaptive $\alpha$ provides admission control





# Kill-Bots under Flash Crowd

	Base Server	Kill-Bots
Number of dropped legitimate requests	360,000	80,000



Kill-Bots authenticates new clients only if it can

# Kill-Bots' Contributions

- First to protect Web servers from DDoS attacks that mimic legitimate browsing
- First to deal with CAPTCHA's bias against legitimates users who don't solve them
- Sends CAPTCHA and checks answer without any server state
- Addresses both DDoS attacks and Flash Crowds
- Orders of magnitude better response time, goodput, and survivable attack rate