



GRAMMATECH

Repairing COTS Router Firmware without Access to
Source Code or Test Suites
A Case Study in Evolutionary Software Repair

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July 12, 2015

The screenshot shows a web browser window with the URL www.pcworld.com/article/2057260/vulnerabilities-in-some-netgear-router-and-nas-products-open-door-to-remote-attacks. The page header includes 'PCWorld', 'Macworld', and 'TechHive' logos, along with social media icons for Facebook and Twitter, and a 'Subscribe' button. The article is categorized under 'SECURITY' with tags 'netgear, routers'. The main title is 'Vulnerabilities in some Netgear routers open door to remote attacks'. On the left side, there are social sharing buttons: a thumbs-up icon with '26', a Facebook 'Like' button, a '47' comment count, a 'Tweet' button, a '3' share count, and a '+1' button. The author is 'Lucian Constantin, IDG News Service' and the date is 'Oct 23, 2013 10:30 AM'.

1. URL starting with `BRS` bypasses authentication
2. URL including `unauth.cgi` or `securityquestions.cgi` bypass authentication
3. unprotected page removes authentication for every page
`http://router/BRS_02_genieHelp.html`

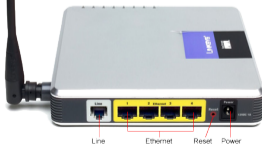
Common Vulnerability



NETGEAR WNDR4700



D-Link DIR-100



Linksys WAG200G

Previous evolutionary repair Requirements

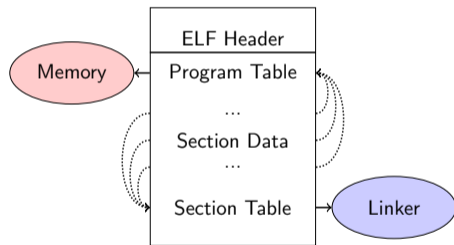
- ▶ Un-stripped ELF file
- ▶ Regression test suite
- ▶ Fault localization information

Reduced evolutionary repair Requirements

- ▶ ~~Un-stripped~~ *arbitrary* ELF file
- ▶ ~~Regression test suite~~
- ▶ ~~Fault localization information~~

ELF Mutation

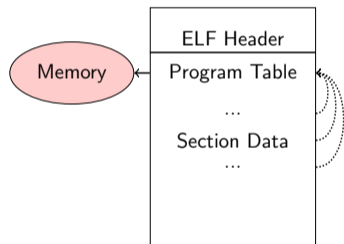
ELF File



Mutate code in `.text` section.

ELF Mutation

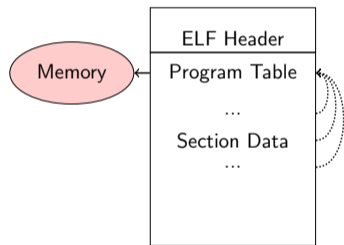
ELF File



Mutate all `PT_LOAD` type sections.

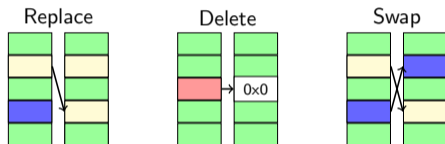
ELF Mutation

ELF File



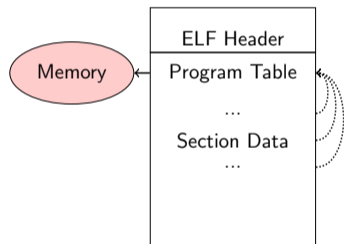
Mutate all PT_LOAD type sections.

MIPS Mutations



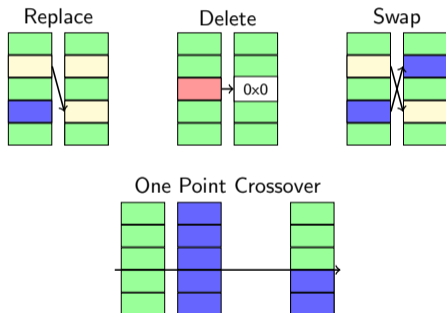
ELF Mutation

ELF File



Mutate all PT_LOAD type sections.

MIPS Mutations



Evolutionary Algorithm

Input: Vulnerable Program, original : *ELF*
Input: Test Suite, suite : [*ELF* → *Fitness*]
Parameters: *populationSize*, *tournamentSize*, *crossRate*
Output: Patched version of Program

```
1: let fitness ← evaluate(original, suite)
2: let pop ← populationSize copies of (original, fitness)
3: repeat
4:   if Random() < CrossRate then
5:     let p1 ← tournament(pop, tournamentSize, +)
6:     let p2 ← tournament(pop, tournamentSize, +)
7:     let p ← crossover(p1, p2)
8:   else
9:     p ← tournament(pop, tournamentSize, +)
10:  end if
11:  let p' ← Mutate(p)
12:  let fitness ← evaluate(suite, p')
13:  incorporate(pop, (p', Fitness(Run(p'))))
14:  if length(pop) > maxPopulationSize then
15:    evict(pop, tournament(pop, tournamentSize, -))
16:  end if
17: until fitness > length(suite)
18: return p'
```

Properties

► Parameters

pop-size	512
tourney-size	2
crossover	$\frac{2}{3}$
fitness evals	~ 10,000

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- reduced memory consumption
- simplifies parallelization
- exploitative

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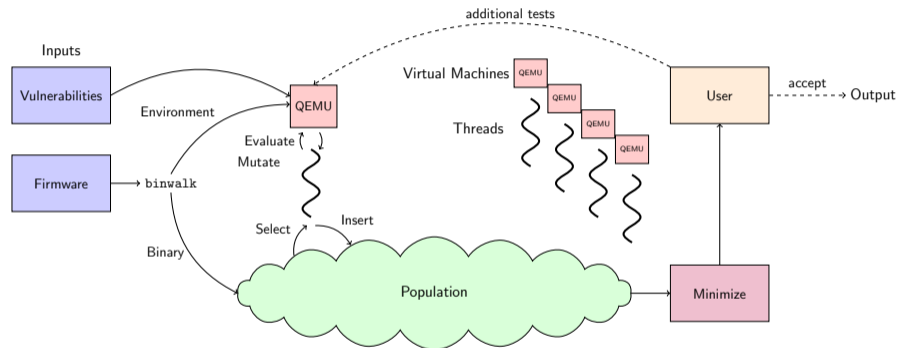
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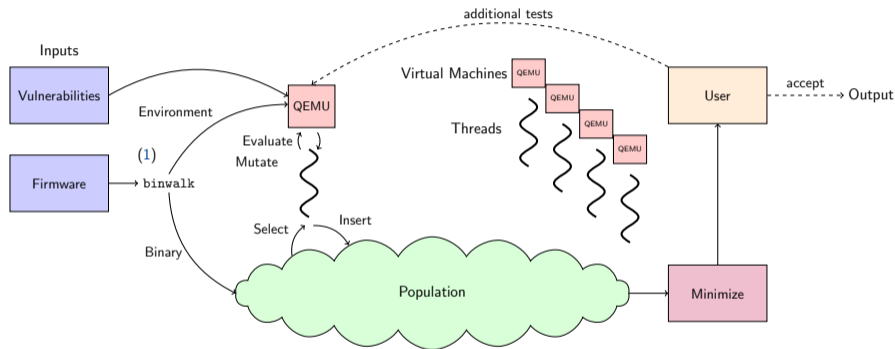
► Eviction & selection use tournaments

NETGEAR Repair Overview



Repair process

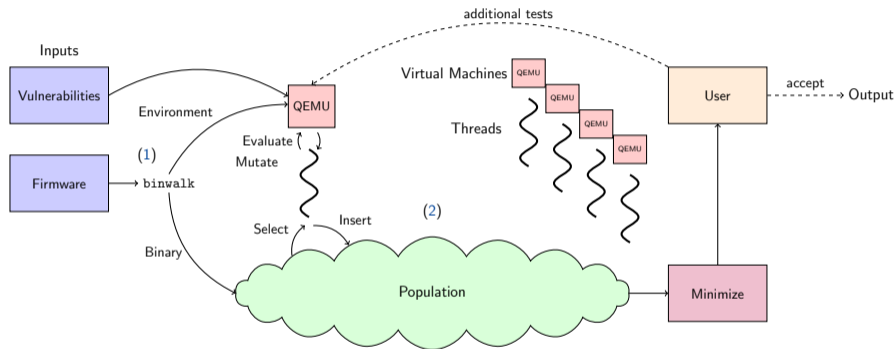
NETGEAR Repair Overview



Repair process

1. Extract binary

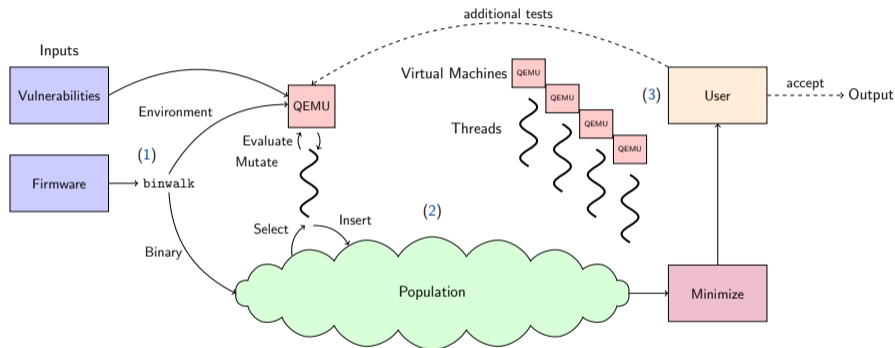
NETGEAR Repair Overview



Repair process

1. Extract binary, 2. Evolve repair

NETGEAR Repair Overview



Repair process

1. Extract binary
2. Evolve repair
3. Interactive review

Evolved repairs

Repair runtime, size, and impact of minimization

Run	Fit Evals	Full Diff	Min Diff	Full Fit	Min Fit
0	90405	500	2	8	22
1	17231	134	3	22	22
2	26879	205	2	21	22
3	23764	199	2	19	22
4	47906	319	2	6	6
5	13102	95	2	16	22
6	76960	556	3	17	22
7	11831	79	3	20	22
8	2846	10	1	14	14
9	25600	182	2	21	22
mean	33652.4	227.9	2.2	16.4	19.6

Evolved repairs

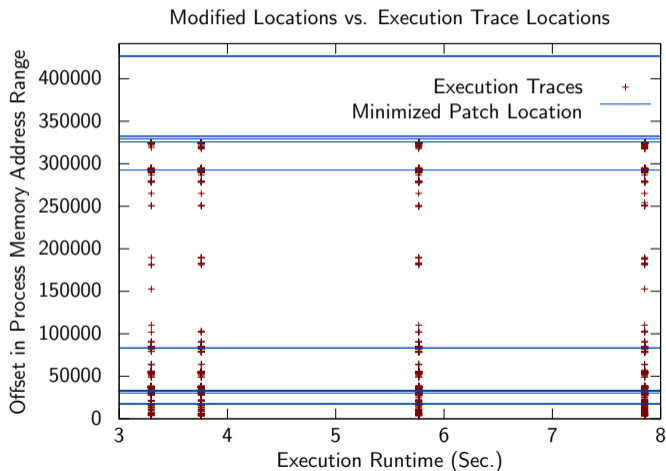
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evaluations ~ 36,000, runtime 86.6 minutes, threads 32

Fix locations

Code modification and fault localization



Contribution and impact

Contributions

EC repair

- ▶ Without a regression test suite
- ▶ Without fault localization
- ▶ Leveraging user interaction
- ▶ Of embedded firmware
- ▶ Of a real-world exploit
- ▶ Of multiple vulnerabilities

Contribution and impact

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- ▶ Without fault localization
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Enables

- ▶ Repair of COTS binaries
 - ▷ Users
 - ▷ Security researchers
- ▶ Repair of data sections
- ▶ Interactive improvement

Questions or Comments?

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