

# Buttercup and DARPA's AI Cyber Challenge



Source: Wikipedia

## BUTTERCUP: World-Class Vulnerability Discovery and Patching



# \$3 Million Award Winner

**28  
Vulnerabilities**

**20 CWE  
Categories**

**90%+  
Accuracy**

👁️ **Watch it work**  
**Live demo**

🧠 **Learn how**  
**AI + Security**

🚀 **Use it**  
**Open source**

# Buttercup Demo

 **Target**  
Modified libpng

 **Goal**  
Find and patch a bug

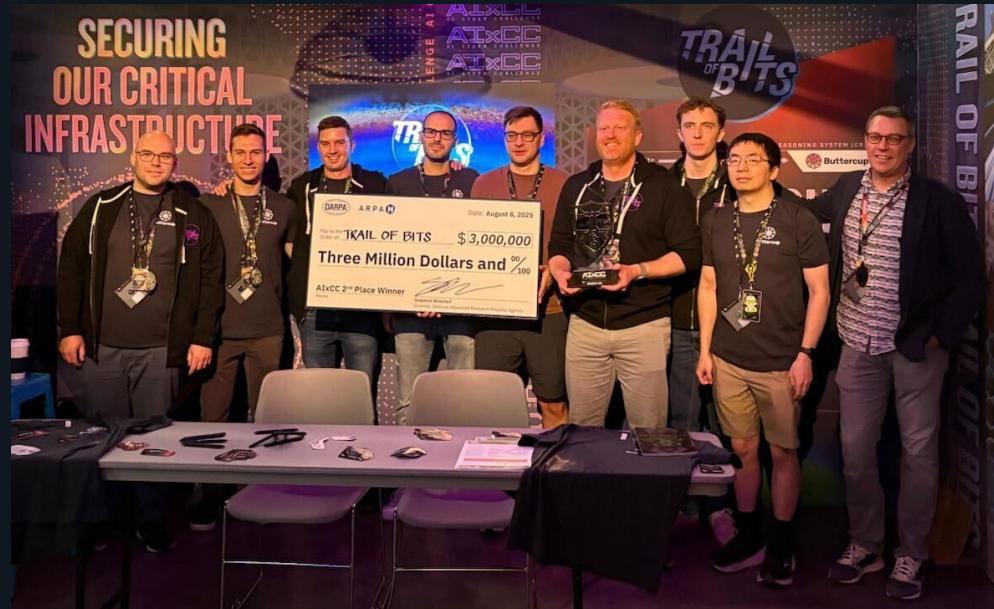
 **Scale**  
Laptop to cluster

# Keys to success

## Accuracy

## Versatility

## Reliability



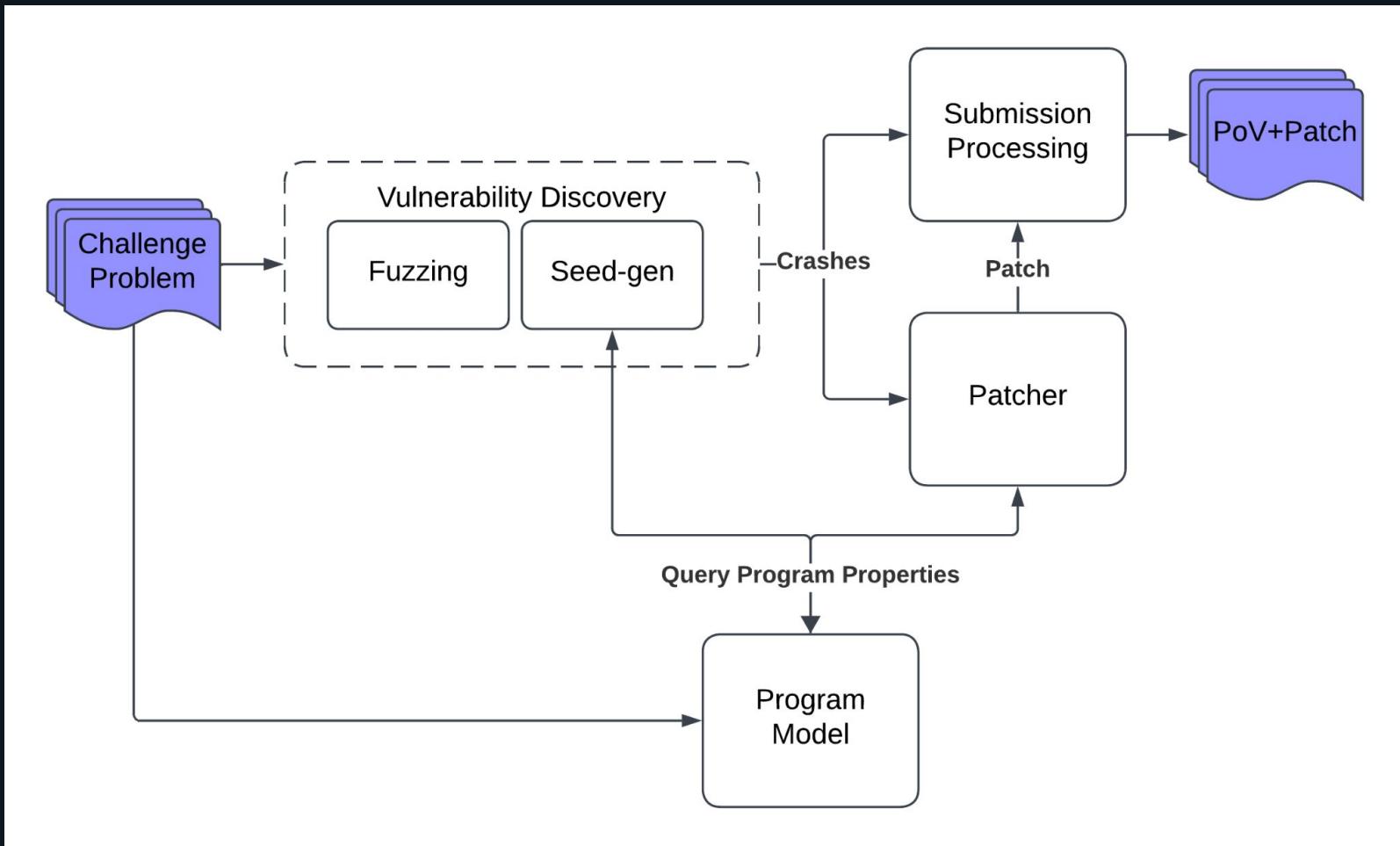


Team	LLM spend	Compute spend	Total spend	Cost per point
Team Atlanta	\$29.4k	\$73.9k	\$103.3k	\$263
<b>Trail of Bits</b>	<b>\$21.1k</b>	<b>\$18.5k</b>	<b>\$39.6k</b>	<b>\$181</b>
Theori	\$11.5k	\$20.3k	\$31.8k	\$151
fuzzing_brain	\$12.2k	\$63.2k	\$75.4k	\$490
Shellphish	\$2.9k	\$54.9k	\$57.8k	\$425
42-b3yond-6ug	\$1.1k	\$38.7k	\$39.8k	\$379
LACROSSE	\$631	\$7.1k	\$7.2k	\$751

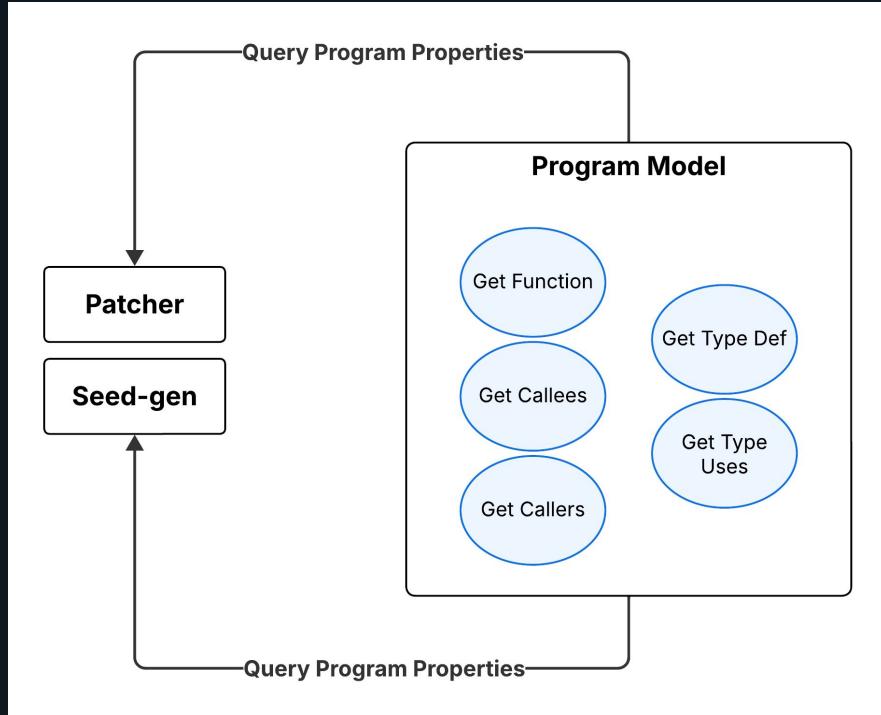
**Results!**

**2nd in LLM Spend  
6th in Compute Spend  
2nd in \$ per Point**

# Buttercup System Design



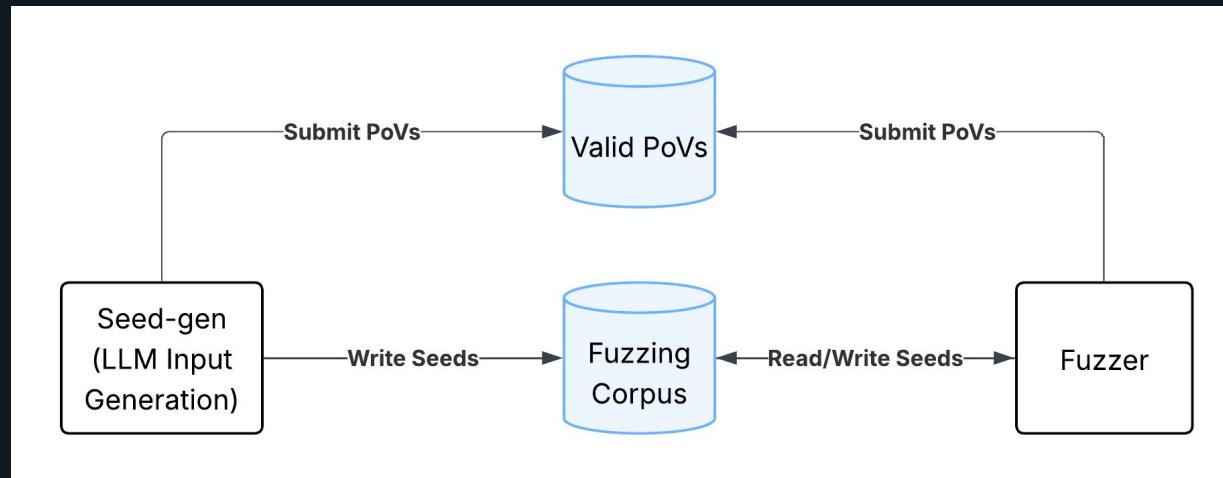
# Program Model



- Constructs program model using CodeQuery + Tree-sitter
- Supports querying program properties (functions & types)
- Used by LLM components

# Vulnerability Discovery

## Approach: Combine fuzzing and LLM input generation



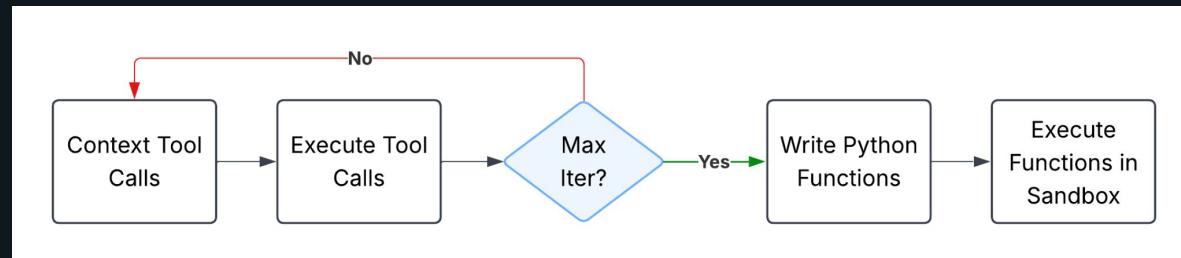
Note: PoVs stands for Proofs of Vulnerability

# Fuzzing

- **Standard OSS-Fuzz fuzzers:**
  - LibFuzzer for C/C++
  - Jazzer for Java
- **Fuzzer bots sample active harnesses to run short fuzz campaigns**
- **Merger bots save inputs which improve coverage**
  - Merge a fuzzer bot's local corpus to the shared corpus

# Seed-Gen: Enhancing Fuzzing

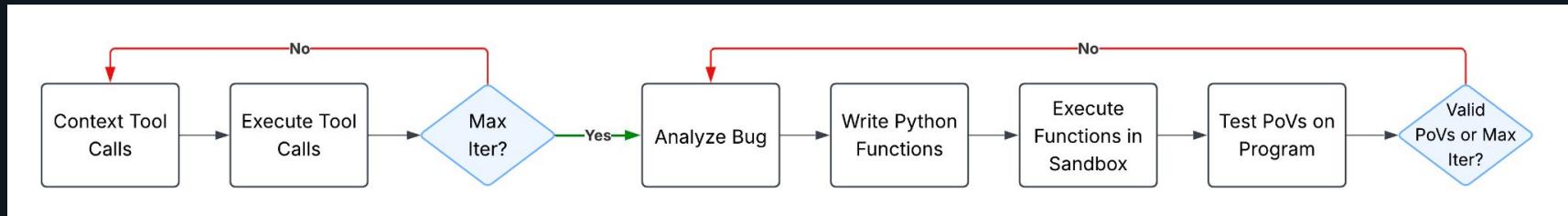
- Generate inputs with LLM to support the fuzzer
- **Initialize Task:** Bootstrap fuzzer with initial seed inputs that exercise harness
- **Explore Task:** Increase coverage for a target function
  - Sample function with low coverage
  - Generate reaching inputs



Initialize and Explore Tasks

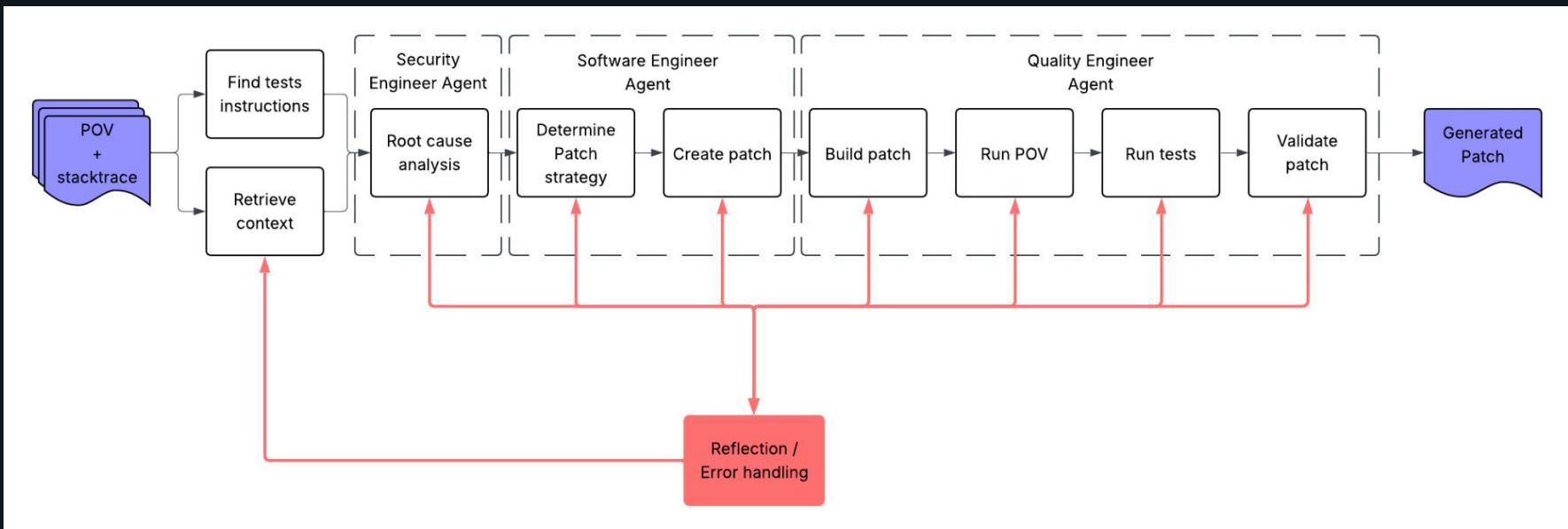
# Seed-Gen: Vulnerability Discovery

- Independently find bugs with an LLM agent
- Vuln discovery task: Identify and validate vulnerabilities to create PoVs
  - Similar to fuzzing: find a triggering input

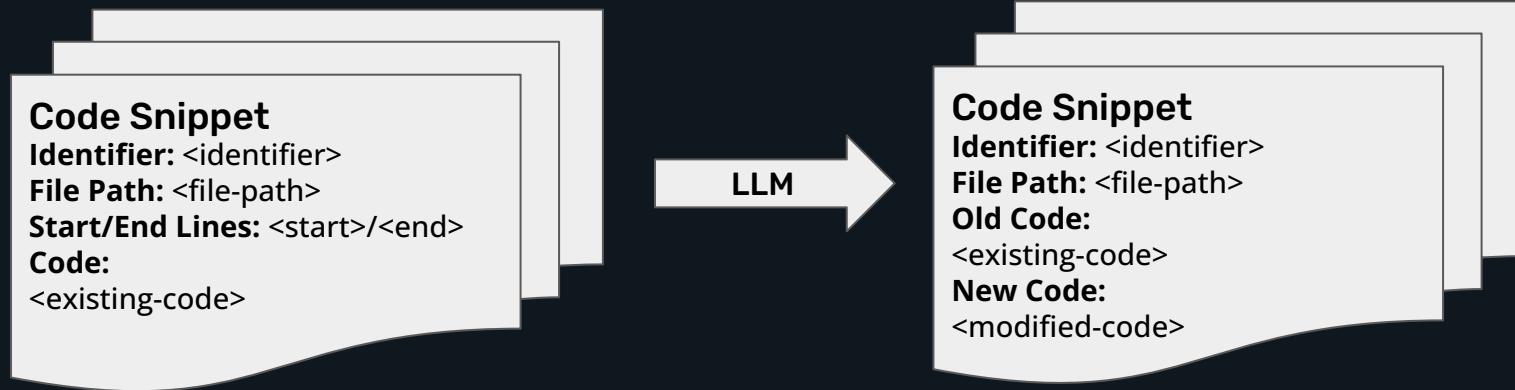


Vulnerability Discovery Task

# Patcher



# Patch Creation



# Building a Reliable AI System

## LLM Testing

- **Experiments**
  - Determine empirically if a change improves performance
- **Observability**
  - Understand what the LLM is doing

## Classic Testing

- **Unit, component, and system integration tests**
- **Weekend competition dry runs**

# What did we learn about AI?

**AI can automate software security tasks-when applied correctly:**

- **What would a security researcher need? The LLM probably needs it too!**
  - Tools: the right context is essential
  - Opportunities to reason and test ideas
- **Validate the LLM output with ground truth as much as possible**
  - Reliable bug oracle for seed-gen PoVs
  - Rigorous process to validate LLM patches
- **Give LLMs well-defined problems**
  - Only select problems where it makes sense to use an LLM

# Buttercup: Beyond the Competition

## Making it accessible

Runs on your laptop, scales to clusters

## Expanding language support

Competition: C/Java Now: C++ Roadmap: Golang, Rust, Python

## Pushing capabilities forward

Gemini models • Advanced agentic workflows • Expanded agent tooling

# Checking the Demo

**Let's check the Buttercup UI!**

## Buttercup CRS Dashboard (dbddd38e35627a058d1a)

Submit  
Task

Refresh

ACTIVE TASKS

0

Currently running

FAILED TASKS

0

CRS submissions failed

TOTAL POVS

0

Vulnerabilities found

TOTAL PATCHES

0

Fixes generated

TOTAL BUNDLES

0

Submissions made

Tasks

PoVs

Patches

All Status ▾

Tasks



No tasks found

Create a new task to get started

ACTIVE TASKS

**0**

Currently running

Tasks

**Tasks****Submit New Task**

Task Name:

Optional custom name

Challenge Repository URL:

https://github.com/user/repo.git

Challenge Repository Head Ref:

main or commit hash

Challenge Repository Base Ref:

Optional base ref for delta analysis

Fuzz Tooling URL:

https://github.com/google/oss-fuzz

Fuzz Tooling Ref:

master

Project Name:

libpng

 Harnesses Included

Duration (seconds):

1800

**Fill example-libpng Values****Cancel****Submit Task**

TOTAL BUNDLES

**0**

Submissions made

Patches

All Status ▾

Submit Task

Example-libpng values filled in. You can now modify them as needed.

## Submit New Task

X

Task Name:

Optional custom name

Challenge Repository URL:

https://github.com/tob-challenges/example-libpng

Challenge Repository Head Ref:

challenges/p-delta-01

Challenge Repository Base Ref:

5bf8da2d7953974e5dfbd778429c3affd461f51a

Fuzz Tooling URL:

https://github.com/google/oss-fuzz

Fuzz Tooling Ref:

master

Project Name:

libpng

 Harnesses Included

Duration (seconds):

1800

Fill example-libpng Values

Cancel

Submit Task

## Buttercup CRS Dashboard (dbddd38e35627a058d1a)

Submit Task

Task a5ae804f-efb9-4e14-b442-99a0ffb1de30 created and submitted successfully to CRS for challenge

ACTIVE TASKS <b>1</b> Currently running	FAILED TASKS <b>0</b> CRS submissions failed	TOTAL POVS <b>0</b> Vulnerabilities found	TOTAL PATCHES <b>0</b> Fixes generated	TOTAL BUNDLES <b>0</b> Submissions made
---	--	---	--	---

Tasks	PoVs	Patches
<a href="#">a5ae804f-efb9-4e14-b442-99a0ffb1de30</a> ID: a5ae804f-efb9-4e14-b442-99a0ffb1de30 Project: libpng Duration: 0h 30m Created: 11/4/2025, 9:26:32 AM Deadline: 11/4/2025, 9:56:32 AM	<span>All Status</span>	<span>ACTIVE</span> 0 0 0

**Task: a5ae804f-efb9-4e14-b442-99a0ffb1de30**

X

**Task Information**

Name:	a5ae804f-efb9-4e14-b442-99a0ffb1de30
ID:	a5ae804f-efb9-4e14-b442-99a0ffb1de30
Project:	libpng
Status:	<b>ACTIVE</b>
Created:	11/4/2025, 9:26:32 AM
Deadline:	11/4/2025, 9:56:32 AM

**PoVs (Vulnerabilities) (0)**

No povs (vulnerabilities) found

**Patches (0)**

No patches found

**Bundles (0)**

No bundles found

**Task: a5ae804f-efb9-4e14-b442-99a0ffb1de30**

X

**Task Information**

Name:	a5ae804f-efb9-4e14-b442-99a0ffb1de30
ID:	a5ae804f-efb9-4e14-b442-99a0ffb1de30
Project:	libpng
Status:	ACTIVE
Created:	11/4/2025, 9:26:32 AM
Deadline:	11/4/2025, 9:56:32 AM

**PoVs (Vulnerabilities) (1)**

ID: a5ae804f-efb9-4e14-b442-99a0ffb1de30	126030c7-3e0c-47d7-9389-21d01942f258	11/4/2025, 9:30:50 AM	<a href="#">Download</a>
<p>Type: Binary Data Size: 133 bytes Hex Preview:</p> <pre>00000000 89 50 4e 47 0d 0a 1a 0a 00 00 00 0d 49 48 44 52  .PNG.....IHDR  00000010 00 00 00 20 00 00 00 20 08 02 00 00 01 8b 1f dd  .... . ....  00000020 35 00 00 00 f2 69 43 43 50 49 44 41 54 48 c7 d5  5...JCCP1ATH..  00000030 93 41 aa 04 21 0c 44 ab c0 7b 78 13 3d 59 d3 73  .A..!D.{X=Y.s  00000040 33 bd 89 d7 68 68 b5 66 d1 0c f4 b9 ab 56 91 23  3...hh,f,...V.#  00000050 80 67 41 4d 41 ca dd bd 9b 1c 01 54 ee 99 33 e4  .gAMA.....T..3.  00000060 08 a0 72 e1 9a 3e 57 a8 b5 fe b6 01 63 8c ae 06  .... </pre>			

**Patches (0)**

No patches found

**Bundles (0)**

No bundles found

**POV: 126030c7-3e0c-47d7-9389-21d01942f258**

X

**Artifact Information**

ID:	126030c7-3e0c-47d7-9389-21d01942f258
Task:	a5ae804f-efb9-4e14-b442-99a0ffb1de30
Task ID:	a5ae804f-efb9-4e14-b442-99a0ffb1de30
Timestamp:	11/4/2025, 9:30:50 AM
Architecture:	aarch64
Engine:	libfuzzer
Fuzzer:	libpng_read_fuzzer
Sanitizer:	address
Testcase Size:	133 bytes
Testcase Preview:	<pre>00000000 89 50 4e 47 0d 0a 1a 0a 00 00 00 0d 49 48 44 52  .PNG.....IHDR  00000010 00 00 00 20 00 00 00 20 08 02 00 00 01 8b 1f dd  .... . . . . .   00000020 35 00 00 00 f2 69 43 43 50 49 44 41 54 48 c7 d5  5....ICCPIDATH..  00000030 93 41 aa 04 21 0c 44 ab c0 7b 78 13 3d 59 d3 73  .A..!D..fx.=Y.s  00000040 33 bd 89 d7 68 68 b5 66 d1 0c f4 b9 ab 56 91 23  3...hh.f....V.#  00000050 80 67 41 4d 41 ca dd bd 9b 1c 01 54 ee 99 33 e4  .gAMA.....T..3.  00000060 08 a0 72 ef 9a 3c 57 a8 b5 fe b6 01 63 8c ae 06  ...r..</pre>

[Download POV](#)

## Buttercup CRS Dashboard (dbddd38e35627a058d1a)

Submit Task

Refresh

ACTIVE TASKS

1

Currently running

FAILED TASKS

0

CRS submissions failed

TOTAL POVS

1

Vulnerabilities found

TOTAL PATCHES

1

Fixes generated

TOTAL BUNDLES

0

Submissions made

Tasks

PoVs

Patches

All Status ▾

Tasks

a5ae804f-efb9-4e14-b442-99a0ffb1de30

ID: a5ae804f-efb9-4e14-b442-99a0ffb1de30

Project: libpng Duration: 0h 30m Created: 11/4/2025, 9:26:32 AM Deadline: 11/4/2025, 9:56:32 AM

ACTIVE 1 1 0

**Task: a5ae804f-efb9-4e14-b442-99a0ffb1de30**

X

**Task Information**

Name:	a5ae804f-efb9-4e14-b442-99a0ffb1de30
ID:	a5ae804f-efb9-4e14-b442-99a0ffb1de30
Project:	libpng
Status:	ACTIVE
Created:	11/4/2025, 9:26:32 AM
Deadline:	11/4/2025, 9:56:32 AM

**PoVs (Vulnerabilities) (1)**

126030c7-3e0c-47d7-9389-21d01942f258 11/4/2025, 9:30:50 AM

Download

Type: Binary Data

Size: 133 bytes

Hex Preview:

```
00000000 89 50 4e 47 0d 0a 1a 0a 00 00 00 0d 49 48 44 52 |.PNG.....IHDR|
00000010 00 00 00 20 00 00 20 08 02 00 00 01 8b 1f dd |.....|....|....|....|
00000020 35 00 00 02 f9 43 43 50 49 44 41 54 48 c7 d5 |....ICCPIDATH.|....|
00000030 93 41 aa 04 21 0c 44 ab c0 7b 78 13 3d 59 d3 73 |A...!D..(x=Y.s)|
00000040 33 bd 89 d7 68 e8 b5 66 d1 0c f4 b9 ab 56 91 23 |3...nhft....V.#|
00000050 80 67 41 4d 41 ca dd bd 9b 1c 01 94 ee 99 33 e4 |.gAMh.....T..3.|
00000060 08 a0 72 ef 9a 3c 57 a8 b5 fe b6 01 63 8c ae 06 |...|.
```

**Patches (1)**

dff6d64d-7b81-46c3-93ca-43656727897c 11/4/2025, 9:40:11 AM

Download

```
diff --git a/pngutil.c b/pngutil.c
index 01e08bf..118ee77 100644
--- a/pngutil.c
+++ b/pngutil.c
@@ -1419,11 +1419,10 @@ png_handle_iccp(png_structrp png_ptr, png_inforp info_ptr, png_uint_32 length)
    if ((png_ptr->colorspace.flags & PNG_COLORSPACE_HAVE_INTENT) == 0)
    {
        uInt read_le...
```

**Bundles (0)**

No bundles found

**PATCH: dff6d64d-7b81-46c3-93ca-43656727897c****Artifact Information**

ID: dff6d64d-7b81-46c3-93ca-43656727897c

Task: a5ae804f-efb9-4e14-b442-99a0ffb1de30

Task ID: a5ae804f-efb9-4e14-b442-99a0ffb1de30

Timestamp: 11/4/2025, 9:40:11 AM

Status: ACCEPTED

Patch Size: 952 characters (712 decoded)

Patch Content:

```
    uInt read_length, keyword_length;
-   uInt max_keyword_wbytes = 41;
-   wpng_byte keyword[max_keyword_wbytes];
+   png_byte keyword[81];

    /* Find the keyword; the keyword plus separator and
       compression method
-   * bytes can be at most 41 wide characters long.
+   * bytes can be at most 81 bytes long.
    */
    read_length = sizeof(keyword); /* maximum */
    if (read_length > length)
```

[Download PATCH](#)[Approve Patch](#)[Reject Patch](#)

## Task: a5ae804f-efb9-4e14-b442-99a0ffb1de30

X

## Task Information

Name: a5ae804f-efb9-4e14-b442-99a0ffb1de30  
ID: a5ae804f-efb9-4e14-b442-99a0ffb1de30  
Project: libpng  
Status: ACTIVE  
Created: 11/4/2025, 9:26:32 AM  
Deadline: 11/4/2025, 9:56:32 AM

## PoVs (Vulnerabilities) (1)

126030c7-3e0c-47d7-9389-21d01942f258 11/4/2025, 9:30:50 AM Download

Size: 133 bytes  
Hex Preview:

```
00000000 89 50 4e 47 0d 0a 0a 00 00 00 0d 49 48 44 52 I...N...G.....[IHDR]
00000010 00 00 00 20 00 00 00 20 08 02 00 00 01 8b 1d dd [....].....
00000020 35 00 00 00 f2 69 43 43 50 49 44 41 54 48 c7 d5 [....].ICPDATH.[]
00000030 93 41 aa 04 21 0c 44 ab c0 7b 78 13 3d 59 d3 73 [A..I.B..(x.+Y.s]
00000040 33 bd 89 d7 68 68 b5 66 d1 0c f4 b9 ab 56 91 23 [3...hh.f....V.#]
00000050 80 67 41 4d 41 ca dd bd 9b 1c 01 54 ee 99 33 e4 1.qMMA.....T..3.
00000060 08 a0 72 ef 9a 3c 57 a8 b5 fa b6 01 63 8c ae 08 [..r.
```

## Patches (1)

dff6d64d-7b81-46c3-93ca-43656727897c 11/4/2025, 9:40:11 AM Download

```
diff --git a/pngutil.c b/pngutil.c
index 01e08bd..118ee77 100644
--- a/pngutil.c
+++ b/pngutil.c
@@ -1419,11 +1419,10 @@ png_handle_iccp(png_structp png_ptr, png_inforp info_ptr, png_uint_32 length)
     if ((png_ptr->colorspace.flags & PNG_COLORSPACE_HAVE_INTENT) == 0)
     {
         uint read_le...
```

## Bundles (1)

2441fc0c-e032-4d7b-aec6-3ea28ebc5c1d 11/4/2025, 9:43:22 AM Download

```
{
    "bundle_id": "2441fc0c-e032-4d7b-aec6-3ea28ebc5c1d",
    "timestamp": "2025-11-04T09:43:22",
    "description": null,
    "broadcast_sarif_id": null,
    "freeform_id": null,
    "patch_id": "dff6d64d-7b81-46c3-93ca-43656727897c",
    "pov_id": "126030c7-3e0c-47d7-9389-21d01942f258",
    "submitted_sarif_id": null
}
```

# How to Use Buttercup

1.

```
$ make setup-local  
<api-key>, next, next, ...  
$ make deploy  
$ make web-ui
```

2.

<https://github.com/org/your-oss-fuzz-compatible-project>

3.

Vulnerability exposing input  
Patch that remediates the vulnerability



# Buttercup



Try out Buttercup:

[github.com/trailofbits/buttercup](https://github.com/trailofbits/buttercup)

Website: [trailofbits.com](https://trailofbits.com)

Blog: [blog.trailofbits.com](https://blog.trailofbits.com)

*TRAIL*  
*OF*  
*BITS*