# PATE Verifier User Manual (Version 0.9)

Galois (pate-darpa-amp@galois.com)

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The PATE verifier is a static relational verification tool designed to ensure that security micropatches applied to binaries are safe and free from unintended consequences. The verifier generates detailed reports that precisely identify the conditions under which two binary versions exhibit identical behavior. This equivalence information can reveal any unforeseen side effects of a binary patch, such as changes to program behaviors beyond those intended by the original fix.

The verifier is intended to enable users to:

- precisely reason about the effects of patches applied to binaries,
- explain potential differences in observable behaviors, accounting for all possible execution paths, and thus
- reduce the time required to develop safe binary patches.

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#### 1 Introduction

This User Manual describes the PATE verifier as of July 2024, and is maintained in the PATE source repository<sup>1</sup>.

The PATE verifier is a static relational verifier for binaries that builds assurance that micropatches have not introduced any adverse effects. The verifier is a static relational verifier that attempts to prove that two binaries have the same observable behaviors. When it cannot, the verifier provides detailed explanations that precisely characterize the difference in behavior between the two binaries. After applying a micropatch to a binary, domain experts can apply the verifier to ensure that the effects are intended.

Note that while the verifier attempts to prove that the original and patched binaries have the same observable behaviors under all possible inputs, it is expected that they do not (or the patch would have had no effect). When the two binaries can exhibit different behaviors, the verifier provides the user with an explanation of how and where the behavior is different.

If DWARF debugging information is available in either the original or patched binary, the verifier will use that information to improve diagnostics. Currently, function names, function argument names, local variable names, and global variable names can be used to make diagnostics more readable, for example, by replacing synthetic names with their source-level counterparts. If working with binaries that do not come with DWARF debug information natively, see the dwarf-writer<sup>2</sup> tool for a possible approach to adding DWARF debug information.

PATE is designed to analyze binaries produced by applying a micropatch at the binary level where overall the pair of binaries are "mostly" similar. It is more difficult for PATE to compare binaries with substantially different control flow due to the challenges in finding corresponding slices to align for analysis. Major control flow divergences may require user input to guide PATE in its analysis process. We have observed that in some cases, compiling two programs with similar source (such as making a small source-level modification and rebuilding) can result in binaries that are more different than the small source code change might imply, as a result of various modern compiler heuristics and optimizations.

Currently, the verifier supports 32-bit ARM binaries, and 64-bit and 32-bit PowerPC binaries.

## 2 Installing the PATE Verifier

#### 2.1 Recommended: Docker Container Image

We recommending using PATE via Docker.

If available, load the Docker image file from a file using:

docker load -i /path/to/pate.tar

Otherwise, build the Docker image from the PATE source repo. Building PATE is a memory-intensive process. We build the Docker image in an environment with 16GB of RAM available to

<sup>1</sup>https://github.com/GaloisInc/pate

<sup>&</sup>lt;sup>2</sup>https://github.com/immunant/dwarf-writer

Docker. Build the image using the following commands:

```
git clone git@github.com:GaloisInc/pate.git
cd pate
git submodule update --init
docker build . -t pate

PATE may subsequently be used via Docker, such as:

docker run --rm -it \
    --platform linux/amd64 \
    -v "$(pwd)"/tests/integration/packet/exe:/target \
    pate \
    --original /target/packet.exe \
    --patched /target/packet.patched.exe \
    -s parse_packet
```

Please see later sections for detailed usage information.

#### 2.2 Alternative: Building from Source

Alternatively, PATE may be compiled from source and run on a host system. The PATE tool is written in Haskell and requires the GHC compiler<sup>3</sup> and cabal<sup>4</sup> to build.

The current version of PATE is developed using GHC version 9.6.2 and cabal version 3.10.2.0. Additionally, the verifier requires a SMT solver to be available in PATH. We recommend yices. The z3 and cvc4 solvers may also work but are not regularly tested with PATE.

Building from source can be accomplished as follows:

```
git clone git@github.com:GaloisInc/pate.git
cd pate
git submodule update --init
cp cabal.project.dist cabal.project
cabal configure pkg:pate
./pate.sh --help
```

Note that ./pate.sh should be used to build PATE (not cabal build or similar).

Once built, invoke PATE locally using the pate.sh script.

## 3 Invoking the PATE Verifier

Once PATE has been built as described in Section 2, use the Docker container (or pate.sh script if building locally from source) to invoke PATE.

Invoking PATE presents the user with an interactive terminal user interface for analyzing a pair

<sup>3</sup>https://www.haskell.org/ghc/

<sup>4</sup>https://www.haskell.org/cabal/

of binaries. Users provide at least the paths to two (the "original" and "patched") binaries at the command line when invoking PATE. Additionally, we recommend also specifying the desired entry point, using -s <symbol>. Providing the specific function of interest will enable PATE to begin reasoning closer to the relevant functionality of interest, greatly reducing the total analysis time required compared to starting from the program entry point. An example invocation using Docker looks like:

```
docker run --rm -it \
   --platform linux/amd64 \
   -v "$(pwd)"/z:/z \
   pate \
   --original /z/my.original.exe \
   --patched /z/my.patched.exe \
   -s start_function_name
```

Users may also wish to provide "hint" inputs that provide metadata that maps symbol names to addresses, easing analysis of stripped binaries. Please see the listing below for details.

The verifier accepts the following command line arguments:

-h,help	Show this help text			
-o,original EXE	Original binary			
-p,patched EXE	Patched binary			
-b,blockinfo FILENAME	Block information relating binaries			
-s,startsymbol ARG	Start analysis from the function with this symbol			
-d,nodiscovery	Don't dynamically discover function pairs based on			
a, nearboovery	calls.			
solver ARG	The SMT solver to use to solve verification			
	conditions. One of CVC4, Yices, or Z3			
	(default: Yices)			
goal-timeout ARG	The timeout for verifying individual goals in seconds			
	(default: 300)			
heuristic-timeout ARG	The timeout for verifying heuristic goals in seconds			
	(default: 10)			
original-anvill-hints ARG				
	Parse an Anvill specification for code discovery			
	hints			
patched-anvill-hints ARG				
	Parse an Anvill specification for code discovery			
	hints			
original-probabilistic-hints ARG				
	Parse a JSON file containing probabilistic function			
	name/address hints			
patched-probabilistic-hints ARG				
	Parse a JSON file containing probabilistic function			
	name/address hints			
original-csv-function-hints ARG				
	Parse a CSV file containing function name/address			

hints --patched-csv-function-hints ARG Parse a CSV file containing function name/address hints --original-bsi-hints ARG Parse a JSON file containing function name/address hints --patched-bsi-hints ARG Parse a JSON file containing function name/address hints --no-dwarf-hints Do not extract metadata from the DWARF information in the binaries -V,--verbosity ARG The verbosity of logging output (default: Info) --save-macaw-cfgs DIR Save macaw CFGs to the provided directory --solver-interaction-file FILE Save interactions with the SMT solver during symbolic execution to this file --proof-summary-json FILE A file to save interesting proof results to in JSON --log-file FILE A file to save debug logs to -e,--errormode ARG Verifier error handling mode (default: ThrowOnAnyFailure) Variable rescoping failure handling mode -r,--rescopemode ARG (default: ThrowOnEqRescopeFailure) --skip-unnamed-functions Skip analysis of functions without symbols --skip-divergent-control-flow <DEPRECATED> --target-equiv-regs ARG Compute an equivalence condition sufficient to establish equality on the given registers after the toplevel entrypoint returns. <DEPRECATED> --ignore-segments ARG Skip segments (0-indexed) when loading ELF -- json-toplevel Run toplevel in JSON-output mode (interactive mode only) --read-only-segments ARG Mark segments as read-only (0-indexed) when loading --script FILENAME Save macaw CFGs to the provided directory Don't add additional assumptions about stack frame --no-assume-stack-scope scoping

#### 4 The PATE Terminal UI

--ignore-warnings ARG

Once PATE has been invoked at the command line (see Section 3), the user is presented with an interactive terminal user interface.

Don't raise any of the given warning types

Internally, PATE maintains a tree representing the state of the analysis. The interactive interface allows users to inspect the tree by selecting from a list of options based on the users current "location" in the tree. The user makes a selection by entering a number representing the node of

interest and hitting enter, or by entering a command.

#### 4.1 Example Usage

Launch PATE on the binaries in the tests/integration/packet/exe/ directory with:

```
docker run --rm -it \
   --platform linux/amd64 \
   -v "$(pwd)"/tests/integration/packet/exe:/target \
   pate \
   --original /target/packet.exe \
   --patched /target/packet.patched.exe \
   -s parse_packet
```

Once launched, PATE presents the user is presented with a list of entry points and makes a selection:

```
Choose Entry Point
0: Function Entry "_start" (segment1+0x435)
1: Function Entry "parse_packet" (segment1+0x554)
?> 1
```

We indicate user input with a yellow highlight. Here the user enters 1, selecting parse\_packet. This starts PATE's analysis at this point, and the user sees output of:

```
0: Function Entry "parse_packet" (segment1+0x554) (User Request)......
1: segment1+0x580 [ via: "parse_packet" (segment1+0x554) ]
  (Widening Equivalence Domains).....
2: segment1+0x5ac [ via: "parse_packet" (segment1+0x554) ]
  (Widening Equivalence Domains)
3: Return "parse_packet" (segment1+0x554)
  (Widening Equivalence Domains).....
4: segment1+0x5cc [ via: "parse_packet" (segment1+0x554) ]
  (Widening Equivalence Domains).....
5: segment1+0x5e0 [ via: "parse_packet" (segment1+0x554) ]
  (Widening Equivalence Domains).....
6: segment1+0x600 [ via: "parse_packet" (segment1+0x554) ]
  (Widening Equivalence Domains)
7: Return "parse_packet" (segment1+0x554)
  (Widening Equivalence Domains).....
8: segment1+0x624 [ via: "parse_packet" (segment1+0x554) ]
  (Widening Equivalence Domains).....
Handle observable difference:
0: Emit warning and continue
1: Assert difference is infeasible (defer proof)
2: Assert difference is infeasible (prove immediately)
3: Assume difference is infeasible
```

4: Avoid difference with equivalence condition ?> 4

PATE represents the analysis as a tree that can be navigated by the user. The top level of the interactive process (reachable via the top command) is a list of all analysis steps that were taken, starting from the selected entry point. Each pair of address and calling contexts defines a unique toplevel proof "node." A given address and context may appear multiple times in the toplevel list, corresponding to each individual time that the address/context pair was analyzed. The latest (highest-numbered) entry corresponds to the most recent analysis of an address/context.

Each entry point is associated with an equivalence domain: a set of locations (registers, stack slots and memory addresses) that are potentially not equal at this point. Locations outside of this set have been proven to be equal (ignoring skipped functions). The analysis takes the equivalence domain of an entry point and computes an equivalence domain for each possible exit point (according to the semantics of the block).

At this point in the example, PATE is asking how a detected observable difference should be handled. The user selects 4 to capture the difference in the equivalence condition, and PATE continues its analysis:

```
0: Function Entry "parse_packet" (segment1+0x554) (User Request)
1: segment1+0x580 [ via: "parse_packet" (segment1+0x554) ]
   (Widening Equivalence Domains)
2: segment1+0x5ac [ via: "parse_packet" (segment1+0x554) ]
   (Widening Equivalence Domains)
3: Return "parse_packet" (segment1+0x554)
  (Widening Equivalence Domains)
4: segment1+0x5cc [ via: "parse_packet" (segment1+0x554) ]
   (Widening Equivalence Domains)
5: segment1+0x5e0 [ via: "parse_packet" (segment1+0x554) ]
   (Widening Equivalence Domains)
6: segment1+0x600 [ via: "parse_packet" (segment1+0x554) ]
  (Widening Equivalence Domains)
7: Return "parse_packet" (segment1+0x554)
   (Widening Equivalence Domains)
8: segment1+0x624 [ via: "parse_packet" (segment1+0x554) ]
  (Widening Equivalence Domains)
9: segment1+0x644 [ via: "parse_packet" (segment1+0x554) ]
   (Widening Equivalence Domains)......
10: segment1+0x644 [ via: "parse_packet" (segment1+0x554) ]
  (Re-checking Block Exits).....
11: segment1+0x654 (original) vs. segment1+0x668 (patched)
  [ via: "parse_packet" (segment1+0x554) ]
  (Widening Equivalence Domains).....
12: segment1+0x668 (original) vs. segment1+0x67c (patched)
  [ via: "parse_packet" (segment1+0x554) ]
  (Widening Equivalence Domains)
13: Return "parse_packet" (segment1+0x554)
```

```
(Widening Equivalence Domains)
Continue verification?
0: Finish and view final result
1: Restart from entry point
2: Handle pending refinements
?> 0
```

The user selects 0 to finish and view the final result.

The PATE analysis tree can be navigated by the user with top to move to the top of the tree, numbers to navigate "into" nodes, up to move "up" a node, and 1s to redisplay the nodes available at a current level.

For example, to inspect the analysis results in the running example, the user may provide input as follows to view the equivalence condition:

```
15: Final Result
> 15
Final Result
0: Assumed Equivalence Conditions
    segment1+0x644 [ via: "parse_packet" (segment1+0x554) ]
2: Binaries are conditionally, observably equivalent
3: Toplevel Result
> 1
segment1+0x644 [ via: "parse_packet" (segment1+0x554) ]
0: ----
1: original
2: patched
3: let -- segment1+0x684.. in not v40494
> 3
let -- segment1+0x684
   v40487 = select (select cInitMemBytes@40467:a 0) 0x11045:[32]
   -- segment1+0x684
   v40490 = select (select cInitMemBytes@40344:a 0) 0x11044:[32]
   -- segment1+0x684
   v40494 = and (eq 0x80:[8] v40487) (not (eq v40490 (bvSum v40487 0x80:[8])))
in not v40494
0: With condition assumed
1: Event Trace: segment1+0x644 .. segment1+0x650 (original) vs.
    segment1+0x644 .. segment1+0x664 (patched)
2: With negation assumed
3: Event Trace: segment1+0x644 .. segment1+0x650 (original) vs.
    segment1+0x644 .. segment1+0x664 (patched)
>
```

Continuing on, the user may view, for example, an example trace showing where the equivalence condition above does not hold:

```
0: With condition assumed
1: Event Trace: segment1+0x644 .. segment1+0x650 (original) vs.
     segment1+0x644 .. segment1+0x664 (patched)
2: With negation assumed
   Event Trace: segment1+0x644 .. segment1+0x650 (original) vs.
     segment1+0x644 .. segment1+0x664 (patched)
> 3
== Initial Original Registers ==
pc <- 0x644:[32]
r0 <- 0x0: [32]
r1 <- 0x1:[32]
r10 <- (3243, 0x0:[32])
r11 <- (3342, 0x0:[32])
r12 <- (2490, 0x0:[32])
== Original sequence ==
(segment1+0x644)
 Read 0x688:[32] \rightarrow 0x108:[32]
 r0 < -0x108:[32]
(segment1+0x648) r0 <- 0x758:[32]
== Initial Patched Registers ==
pc <- 0x644:[32]
r0 < -0x0:[32]
r1 \leftarrow 0x1:[32]
r10 \leftarrow (3243, 0x0: [32])
r11 <- (3342, 0x0:[32])
r12 \leftarrow (2490, 0x0: [32])
== Patched sequence ==
(segment1+0x644)
 Read 0x11044:[32] -> 0x80:[8]
 r1 <- 0x80:[32]
(segment1+0x648)
 Read 0x11045:[32] \rightarrow 0x80:[8]
 r2 <- 0x80:[32]
```

See the following subsections for details about how to interpret and interact with the terminal user interface.

#### 4.2 Status Indicators

The *prompt* indicates the status of the current node as follows:

- \*> current node still has some active task running
- ?> current node requires user input
- !> current node has raised a warning
- x> current node has raised an error

• > current node, and all sub-nodes, have finished processing

Similar to the prompt, nodes may be printed with a suffix that indicates some additional status as follows:

- (\*) node still has some active task running
- (?) node requires user input
- (!) node has raised a warning
- (x) node has raised an error

A status suffix indicates that the node, or some sub-node, has the given status. e.g. at the toplevel the prompt x> indicates that an error was thrown during some block analysis, while the corresponding node for the block will have a (x) suffix.

#### 4.3 Navigation Commands

- # navigate to a node, printing its contents
- up navigate up one tree level
- top navigate to the toplevel
- goto\_err navigate to the first leaf node with an error status
- next navigate to the highest-numbered node at the current level

#### 4.4 Diagnostic Commands

- status print the status of the current node
- full\_status print the status of the current node, without truncating the output
- 1s print the list of nodes at the current level
- wait wait at the current level for more results. Exits when the node finishes, or the user provides any input

When the prompt is ?>, the verifier is waiting for input at some sub-node. To select an option, simply navigate (i.e. by entering #) to the desired choice. For example, goto\_prompt - navigate to the first leaf node waiting for user input.

### 5 The PATE Binary Ninja Plugin

The PATE Binary Ninja plugin enables user to invoke and interact with PATE directly within the Binary Ninja reverse engineering platform.

The PATE plugin requires a commercially-licensed Binary Ninja installation. We have tested PATE with Binary Ninja stable version 4.0.5336.

#### 5.1 Installation

First, install the PATE Docker container as described in Section 2.

Second, copy (or create a symlink from) the pate\_binja/ directory from the PATE source repo to your local Binary Ninja plugins/ directory. Typically these are found in:

```
macOS $HOME/Library/Application Support/Binary Ninja/plugins/Linux $HOME/.binaryninja/plugins/
```

The Binary Ninja plugin requires a relatively recent version of Python (3.10 or newer) and requires the grpcio package. If these are not present on the system, we recommend creating a Python venv or similar on your host, with something like:

```
python -m venv /path/to/new/virtual/environment
source /path/to/new/virtual/environment/bin/activate
pip install grpcio
```

and then modifying Binary Ninja Python settings appropriately in the Binary Ninja Preferences list to point to this new environment. Specifically, check the settings for:

- Python Path Override
- Python Interpreter
- Python Virtual Environment Site-Packages

Once these steps have been completed, restart Binary Ninja. If the plugin is correctly installed and initialized, then the "Plugins" menu will now have a "Pate..." menu option.

#### 5.2 Usage

In Section 4 we examined the packet.exe example using the PATE terminal UI. In this section, we describe analyzing the same example using the PATE Binary Ninja plugin.

Once installed, invoke the PATE plugin from the Binary Ninja "Plugins → Pate..." menu option.

The PATE plugin opens a window to select a *run configuration* file in JSON format. This file must end in the suffix .run-config.json. The run configuration must contain a key-value map with the following keys:

```
original (absolute or relative) file path to the original binary
patched (absolute or relative) file path to the patched binary
args a list additional arguments to pass to PATE
```

For example, the file tests/integration/packet/packet.run-config.json contains:

```
{
  "original": "exe/packet.original.exe",
  "patched": "exe/packet.patched.exe",
  "args": [
     "-s parse_packet"
  ]
}
```

After selecting the run configuration file, the PATE plugin will open three Binary Ninja tabs: one for each of the original and patched binaries, and a third PATE analysis tab.

As shown in Figure 1, the PATE analysis tab is composed of two primary regions. The bottom

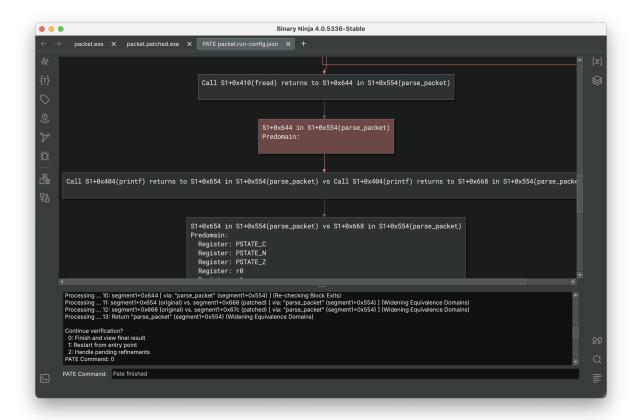


Figure 1: The PATE Binary Ninja Plugin. The top region is the PATE analysis overview graph. The bottom panel is used by the operator to interact with the PATE verifier.

portion is an interactive text view that corresponds to the terminal user interface. The user interacts with this region through the text input field at the bottom of the window. In the packet.exe example, the user enters the same commands described in Section 4 through the Finish and view final result step, at which point results will be rendered in the interactive Binary Ninja view.

The top portion of the PATE analysis tab is a graph view showing the current state of the PATE analysis. When PATE analysis is complete (via interaction in the bottom portion), the PATE graph shows rectangles for each slice of the program analyzed by PATE. Default-colored rectangles represent a pair of programs slices that were able to matched up between the original and patched binary. Green rectangles represent slices present only in the original program, if any. Blue rectangles represent slices present only in the patched program, if any. Right click on a rectangle for options to jump directly to the relevant program location in the appropriate tab for the corresponding binary.

A red rectangle represents the "active" region, where PATE has found an equivalence condition. Right click and select "Show Equivalence Condition" to open the Equivalence Condition window. Please see Figure 2 for an example screenshot of the equivalence condition window in the PATE Binary Ninja plugin. An equivalence condition window includes:

• the expression describing the conditions under which programs behave equivalently

- a generated (concretized) trace through the program(s) showing an example where the equivalence condition is met
- a generated (concretized) trace through the program(s) showing an example where the equivalence condition is *not* met

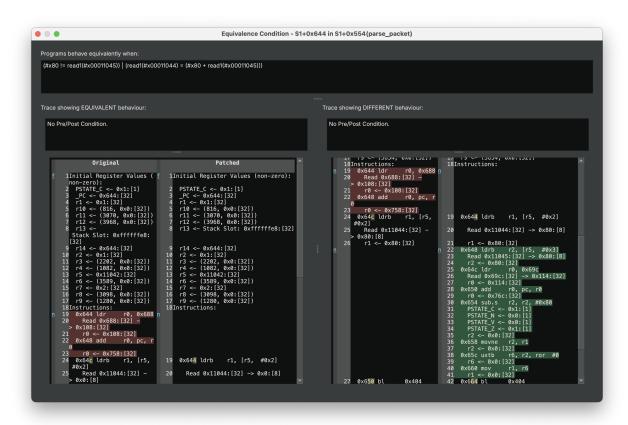


Figure 2: The PATE Binary Ninja pluqin equivalence condition window.

Right clicking on a rectangle in the PATE analysis graph and selecting "Show Instruction Trees" will open a new window showing basic blocks from the original program on the left and corresponding basic blocks from the patched program on the right. At the bottom will be a linearized representation of the instruction trees in the original and patched program, with colorized diff view. Instructions conditionally reachable through conditional control flow edges (if any) are prefixed by + or - to differentiate instructions in distinct branches. See Figure 7 for an example of the instruction tree view, with MCAD integration (described below).

#### 5.3 Trace Constraints

The concretized traces shown in the equivalence condition window (see Figure 2) show a pair of possible traces through the program slices where the equivalence condition is either met or not met. In general there may be multiple paths through the program that may satisfy (or contradict) the equivalence condition. To observe alternative concrete traces, the final equivalence condition may be provided trace constraints, which restrict the values that PATE may choose when generating a concrete trace. When viewing the final equivalence condition, after the verifier has finished and the user has requested the final result, the window now shows an addition button at the bottom

that allows for providing constraints to the given trace (see Figure 3).

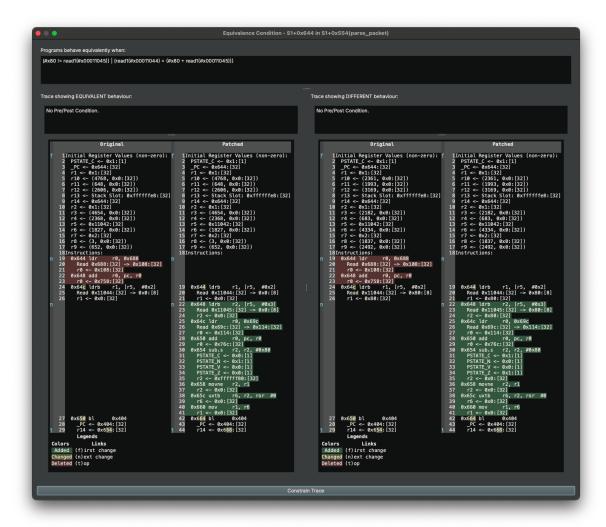


Figure 3: Equivalence condition window with button to constrain trace.

When "Constrain Trace" is clicked, the "Trace Constraint" window (see Figure 4) appears. The "Variable" dropdown is populated with the memory reads from both the original and patched programs. Notably each read is prefixed with the instruction address that the read occurred at, indicating that the constraint applies to the content of memory at that specific program point. The user then selects a relation and enters an integer value to compare the memory content against. Clicking "Add" will then add the specified constraint to the list below (see Figure 5).

Multiple constraints may be added at this point, or removed via the "Remove Constraint" button. Once the desired set of constraints has been provided, clicking "OK" will close the dialogue and present an updated equivalence condition window containing the now-constrained traces (see Figure 6). Notably the equivalence condition itself has also been simplified under the trace constraints. This may, for example, remove some clauses that are now necessarily true under the given constraint, or simplify the entire condition to simply *true* if the given constraints imply that the equivalence condition holds.

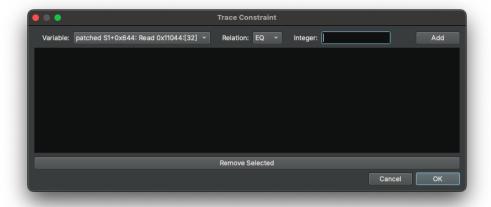


Figure 4: Empty trace constraint dialogue.

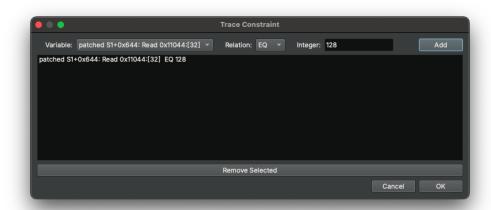


Figure 5: Trace constraint dialogue with added constraint.

#### 5.4 Replays

Executing a run configuration file with the PATE plugin will produce a replay in a file named lastrun.replay, which can be preserved by renaming to another filename on disk. These files cache the user input and verifier output, enabling the user to load a previous interaction with PATE without having to re-execute the verifier analysis. If the user loads a replay rather than a run configuration, the process is mostly the same, except the command input field is already populated with the recorded user input, and the user just hits "enter" to proceed to the next step. Editing the input commands will have no effect, as the responses are recorded in the replay file. That is, the user cannot deviate from the pre-recorded responses from the PATE verifier to perform any analysis other than the one recorded.



Figure 6: Expanded equivalence condition window with constrained traces.

#### 5.5 MCAD Integration

MCAD<sup>5</sup> is a performance analysis tool that performs static prediction of instruction timings for sequences of instructions such as those identified by PATE. The details of the MCAD system is outside of the scope of this user guide, but if the MCAD Docker container is available, the PATE Binary Ninja plugin will show MCAD-predicted cycle counts next to each instruction in the Instruction Trees view, as shown in Figure 7. Use the PATE plugin preference option "MCAD Docker image name" to specify the name of the MCAD Docker container on the host in order to enable MCAD integration in the PATE plugin.

 $<sup>^5</sup>$ https://github.com/securesystemslab/LLVM-MCA-Daemon

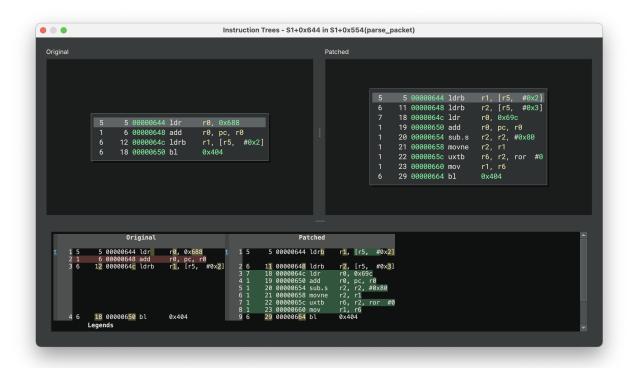


Figure 7: PATE Binary Ninja MCAD integration showing predicted cycle counts (per instruction, cumulative) for instructions in original (left) and patched (right) basic blocks.

### 6 Acknowledgements

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