

## Automatic Tools for Finding Bugs

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## Important to Develop Techniques to Discover Bugs/Vulnerabilities in Programs

- Programs tend to have bugs
- Ideally, prove programs correct/secure
  - E.g., using pre/post condition & invariants as discussed in earlier lecture
  - However, automated proofs hard to scale to large programs
- One alternative, find as many bugs as we can
- Key question: how to find bugs in programs?

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## Approach I: Black-box Fuzz Testing

- Given a program, simply feed it random inputs, see whether it crashes
- Advantage: really easy
- Disadvantage: inefficient
  - Input often requires structures, random inputs are likely to be malformed
  - Inputs that would trigger a crash is a very small fraction, probability of getting lucky may be very low

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### Enhancement: With Protocol/Format Info

- **Mutation-based fuzzing:**
  - Take a well-formed input, randomly perturb (flipping bit, etc.)
  - E.g., ZZUF, very successful at finding bugs in many real-world programs, <http://sam.zoy.org/zzuf/>
    - » Try out your own tool there
- **Generation-based fuzzing**
  - Using specified protocols/file format info
  - E.g., SPIKE by Immunity  
<http://www.immunitysec.com/resources-freesoftware.shtml>
- **Shortcomings:**
  - Still hard to find the rare cases that would trigger the bug

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### Approach II: Constraint-based Automatic Test Case Generation

- **Look inside the box**
  - Use the code itself to guide the fuzzing
- **Assert security/safety properties**
- **Explore different program execution paths to check for security properties**
- **Challenge:**
  1. For a given path, need to check whether an input can trigger the bug, i.e., violate security property
  2. Find inputs that will go down different program execution paths

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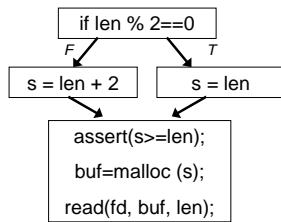
### Running Example

```
f(unsigned int len){
    unsigned int s;
    char *buf;
    if len % 2==0;
    then s = len;
    else s = len + 2;
    buf = malloc(s);
    read(fd, buf, len);
    ...
}
```

- Where's the bug?
- What's the security/safety property?
  - $s \geq \text{len}$
- What inputs will cause violation of the security property?
  - $\text{len} = 2^{32} - 1$
- How likely will random testing find the bug?

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## Running Example



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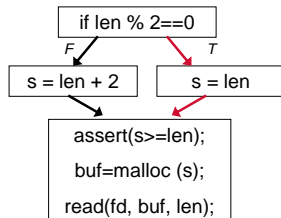
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## Symbolic Execution



- Test input `len=6`
- No assertion failure
- What about all inputs that takes the same path as `len=6`?

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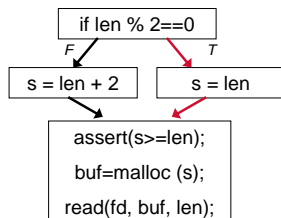
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## Symbolic Execution



- What about all inputs that takes the same path as `len=6`?
- Represent `len` as symbolic variable

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## Symbolic Execution

- Represet inputs as symbolic variables
- Perform each operation on symbolic variables symbolically
  - $x = y + 5;$
- Registers and memory values dependent on inputs become symbolic expressions
- Certain conditions for conditional jump become symbolic expressions as well

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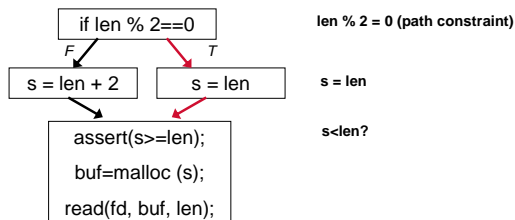
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## Symbolic Execution



- What about all inputs that takes the same path as len=6?
- Represent len as symbolic variable

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## Using a Solver

- Is there a value for len s.t.  
 $\text{len} \% 2 = 0 \wedge s = \text{len} \wedge s < \text{len}?$
- Give the symbolic formula to a solver
- In this case, the solver returns No
  - The formula is not satisfiable
- What does this mean?
  - For any len that follows the same path as len = 6, the execution will be safe
  - Symbolic execution can check many inputs at the same time for the same path
- What to do next?
  - Try to explore different path

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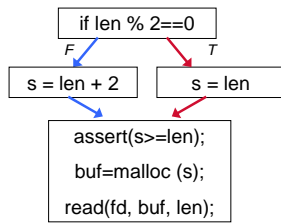
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## How to Explore Different Paths?



- Previous path constraint:  $\text{len} \% 2 = 0$
- Flip the branch to go down a different path:
  - $\text{len} \% 2 \neq 0$
- Using a solver for the formula
  - A satisfying assignment is a new input to go down the path

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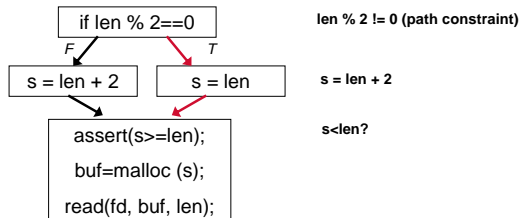
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## Checking Assertion in the Other Path



- Is there a value for len s.t.  
 $\text{len} \% 2 \neq 0 \wedge s = \text{len} + 2 \wedge s < \text{len}$ ?
- Give the symbolic formula to a solver
  - Solver returns satisfying assignment:  $\text{len} = 2^{32} - 1$
  - Found the bug!

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## Summary: Symbolic Execution for Bug Finding

- Symbolic execution a path
  - Create the formula representing:  
path constraint  $\wedge$  assertion failure
  - Give the solver the formula
    - » If returns a satisfying assignment, a bug found
- Reverse condition for a branch to go down a different path
  - Give the solver the new path constraint
  - If returns a satisfying assignment
    - » The path is feasible
    - » Found a new input going down a different path
- Pioneer work
  - EXE, DART

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## Challenges

- Too many paths to explore
  - Exponential or infinite # of paths
- How to address the challenge?
  - Prioritize for block/branch coverage

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## Other Applications to Symbolic Execution

- Automatic signature generation
- Automatic patch-based exploit generation

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## Administrivia

- HW4 due today
- Project milestone #2 due Wed

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## Other Applications to Symbolic Execution

- Automatic signature generation
- Automatic patch-based exploit generation

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## Symbolic Execution for Signature Generation

- Instead of bit patterns, use root cause
  - Generating signatures based on vulnerability
- As exploits morph, they need to trigger vulnerability
- So, vulnerability puts constraints on exploits
- Problem reduction:
  - Signature generation = constraints on inputs that trigger vulnerability
- Symbolic execution

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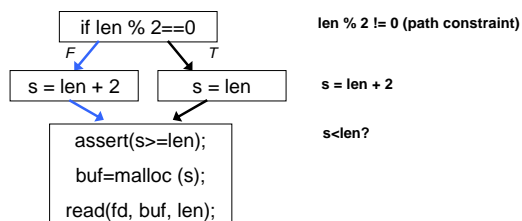
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## Identifying the Constraints



- Given exploit len =  $2^{32} - 1$
- Constraint on len to trigger vulnerability:  
 $\text{len} \% 2 \neq 0 \wedge s = \text{len} + 2 \wedge s < \text{len}$
- Use this constraint as the signature

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## Signature Quality

- False positive?
  - No
- False negative?
  - Depending on path coverage
- Challenge
  - Increase path coverage

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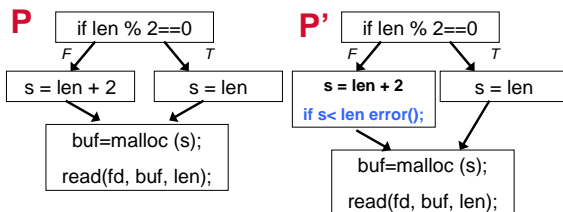
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## Automatic Patch-based Exploit Generation



- Patch leaks
  - Vulnerability point (where in code)
  - Vulnerability condition (under what conditions)
- Exploits for P are inputs that fail vulnerability condition at vulnerability point
  - $\text{len} \% 2 \neq 0 \wedge s = \text{len} + 2 \wedge s < \text{len}$

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## Procedure Summary

1. Diff P and P' to identify candidate vuln point and condition
2. Create input that satisfy candidate vuln condition in P'
  - i.e., candidate exploits
3. Check candidate exploits on P

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## Real-world Examples

- **5 Microsoft patches**
  - Mostly 2007
  - Integer overflow, buffer overflow, information disclosure, DoS
- **Automatically generated exploits for all 5 patches**
  - In seconds to minutes
  - 3 out of 5 have no publicly available exploits
  - Automatically generated exploit variants for the other 2

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## Conclusion

- **Automatic testing for bug finding**
  - Symbolic execution
    - » check all inputs along the same path at the same time
    - » Automatically finding new inputs to go down different paths
- **Other applications for symbolic execution**
  - Automatic signature generation
  - Automatic patch-based exploit generation

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