# NAVEX: Precise and Scalable Exploit Generation for Dynamic Web Applications

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# **Web Applications**

- Common Characteristics
  - Content generated on the fly to improve usability and responsiveness
  - Tasks require a series of steps to accomplish
    - e.g., online shopping: view  $\rightarrow$  select  $\rightarrow$  add to cart  $\rightarrow$  checkout
  - Dependencies among them
- However
  - Increase application complexity
  - Increase analysis difficulty

# **Web Application Example**



- How to Exploit?
  - Find a vulnerability
  - Craft an exploit string for that vulnerability
  - Find a navigation path to the vulnerability
    - e.g.: http...view.php → http...cart.php → http...checkout.php
- Exploit is:
- 1. <u>http://localhost../view.php?item\_quant=3&item\_name=book</u>
- 2. <u>http://localhost../addToCart.php?type=order</u>
- 3. <u>http://localhost.../checkout.php?delivery\_desc=nothing'; DROP table TB- -&submit=yes</u>

# **Problem & Challenges**

- **Problem:** How to automatically construct exploits for large and complex web application?
- Challenge #1: Scalability:
  - Large code base consisting of hundreds of modules with large number of intramodule execution paths
- Challenge #2: Sinks reachability:
  - Have to derive inputs that reach 'deep sinks'
  - Exploit input has to
    - navigate through the complex dependencies among modules
    - satisfy module and path constraints

# **Challenges**

- Challenge #3: Dynamic features of web applications
  - dynamically generated content may drive the navigation of the application to vulnerable sinks
    - Forms, links, JavaScript content
- Challenge #4: handling multiple vulnerability classes
  - e.g., injection vulnerabilities (SQLI, XSS, etc.) and logic vulnerabilities (e.g., EAR)
  - minimal changes to the analysis
- ➡ Goal: Automatic exploit generation approach that addresses these challenges

Our Main Contribution: NAVEX, a system that has identified over two hundred exploits in modern PHP web applications

# **Approach Overview**

- Find vulnerable sinks using static analysis methods
- Build a graph representation of navigation structure of applications dynamically
- Find navigation paths to the identified vulnerabilities
- Final exploit construction

#### **NAVEX Architecture**





# **Step I: Vulnerable Sinks Identification**

- Graph model of source code
- Based on Code Property Graphs (CPGs)
  - CPG = AST+CFG+ call graph+DDG
- Extend CPGs with *sanitization* and *database constraints* tags
- Find vulnerable paths to sensitive sinks
- Path sensitive analysis
- **Types: Forward** and **backward** traversals based on vulnerability type
  - E.g., backward search for injection vulnerabilities

- Construct formulas from vulnerable path statements
- Use solver to generate exploit strings

[Vulnerable Sinks, Exploit Strings]

# **Step II: Concrete Exploits Generation**



Арр

- Links: stored and used as new URLs to crawl
- Forms: Generate form inputs automatically
  - Extract constraints from forms
- JavaScript : concolic execution based on NoTamper (Bisht et al., CCS'10)
- An application-wide navigation graph
  - represents possible sequences of module executions
- Directed graph
  - node: HTTP request
  - edge: navigation between nodes (type is *link* or *form*)

• Search the NG to find navigation paths to vulnerable sinks

### **Input Generation**



# **Combining Static & Dynamic Results**

- Example:
  - vulnerability in PathToApp/App/checkout.php, checkout.php is included by hold.php (no direct access)
  - Navigation Graph: no node of a URL = "....checkout.php"
- **Problem:** combining the results produced by the step of vulnerable sink identification (static analysis) with the Navigation Graph (dynamically generated).
- Solution: Inclusion Map
  - Constructed statically, [Parent file -> included files]

# **Searching Navigation Graph**



- Input :
  - vulnerable sink (destination URL) = http://localhost/App/hold.php
  - exploit string is msg =<script>alert("XSS");</script> (GET)
  - Public URL (source URL) = http://localhost/App/selectBooks.php
- Search Results:
  - c nodes of [id=2, id=3, id=4, id=5, id=6]
    - http://localhost/App/hold.php?step=checkout&msg=done
    - http://localhost/App/hold.php?step=checkout&msg=<script>alert("XSS");</script>

# **Final Exploit**



- 1. http://localhost/App/index.php
- 2. http://localhost/App/selectBooks.php

POST params: [book name=intro to CS by author1, edition=2, publisher=aaaaaaaa]

- 3. http://localhost/App/selectBooks.php?action=borrow
- 4. http://localhost/App/hold.php
- 5. http://localhost/App/hold.php?step=checkout
- 6. http://localhost/App/hold.php?step=checkout&msg=<script>alert("XSS");</script>

# EVALUATION

#### Dataset

- 26 real-world open-source PHP web applications
- Total of 3.2M SLOC and 22K PHP files
- Applications selection criteria
  - **Popular and large** PHP apps
    - Such as WordPress, OpenConf, HotCRP, Drupal, Gallery, Joomla, LimeSurvey, Collabtive, and MediaWiki
  - Comparison with state-of-the-art work in exploit generation (e.g., Chainsaw (Alhuzali et al., CCS'16)) and vulnerability analysis (e.g., RIPS (Dahse and Holz, NDSS'14))

## **Results Summary**

- NAVEX constructed a total of 204 exploits
  - 195 are on injection vulnerabilities (SQLI and XSS).
  - 9 are on logic vulnerabilities (EAR).
- The enhanced CPG reduced FPs by 87% on average.
- Client-side code analysis for building the navigation graph enhanced the precision of exploit generation by 54% on average.
- Drill down as deep as 6 HTTP requests to stitch together exploits.

# **SQLI Exploits**

- Reported 155 SQLI exploitable sinks
- No false positives
- Constructed 105 concrete SQLI exploits
- Vulnerable web apps
  - osCommerce (2.3.3)
  - phpBB (2.0.23)
  - myBloggie, Scarf, Dnscript, WeBid, Eve, SchoolMate, geccbblite, FAQforge, and WebChess

## **XSS Exploits**

- Found 133 XSS exploitable sinks
- 5 false positives
- Generated 90 XSS exploits
- Vulnerable web apps
  - HotCRP (2.60)
  - osCommerce (2.3.4)
  - osCommerce (2.3.3)
  - CPG
  - MediaWiki
  - phpBB (2.0.23)
  - myBloggie, Scarf, Dnscript, WeBid, Eve, SchoolMate, FAQforge, and WebChess

# EAR EXPLOITS (LOGIC EXPLOITS)

- Found **22 EAR** vulnerabilities
- 3 false positives
- Generated 9 EAR exploits
- Vulnerable web apps
  - HotCRP (2.100)
  - HotCRP (2.60)
  - OpenConf
  - osCommerce (2.3.4)
  - osCommerce (2.3.3)
  - LimeSurvey
  - Collabtive
  - MediaWiki
  - myBloggie, WeBid, and Eve

# **Performance and Scalability**

- **Performance**: total time to find exploitable sinks and to generate exploits per vulnerability type.
  - Vulnerability identification from 17.28 to 109.27 minutes.
  - Exploit generation from 1.38 to 40.20 minutes.



# **Effect of Client-side Code Analysis**

- Forms are common
  - Number of unique forms ranges from 3 to 186 (average of 45 form/application).
- Input generation and constraints extraction from client-side code → improve the crawling coverage.
- NAVEX constructed more exploits.



#### Conclusion

- NAVEX is an automatic exploit generation system that considers
  - dynamic features and the navigational complexities of modern web applications
- NAVEX constructed **204 exploits** 
  - 195 are on injection vulnerabilities
  - 9 are on logic vulnerabilities
- **Outperform prior work** on the precision, efficiency, and scalability of exploit generation.

## THANK YOU FOR YOUR ATTENTION QUESTIONS?

NAVEX is available at https://github.com/aalhuz/navex



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