# Improved Error Reporting for Software that Uses Black-box Components

Jungwoo Ha, Christopher Rossbach, Jason Davis, Indrajit Roy, Hany Ramadan, David Chen, Donald Porter, and Emmett Witchel

**Department of Computer Sciences The University of Texas at Austin** 

## Bad Error Messages are Painful



## Improved Error Reporting



- Your remote shared directory was disconnected. Please follow the steps to reconnect it.
  - Step 1. .....
  - Step 2. .....
  - ...

#### Bad Error Reporting is a Serious Problem

- Bad error reporting costs money
  - 25% of sysadmin time wasted due to bad error messages [Barrett '04]
  - Home users pay for personal assistant
    - o e.g. http://www.gotomypc.com

#### Why Not Fix The Software?

- Black-box software components are popular
  - Source code is not available
- Practical problems
  - Abstraction obscures global context
    - Predefined error codes
    - Exceptions
  - Multiple error cases map to a single error message
  - Developers cannot anticipate all failure modes

#### Talk Outline

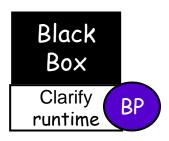
- o Error reporting is a serious problem
- Clarify: A System to Improve Error Reporting
- Evaluation of Clarify
  - Accuracy
  - Overhead
  - Scalability
- o Conclusion

#### Search Workarounds with Behavior Profile

- Behavior Profile (BP) replaces keyword when searching
- Behavior Profile provides the global context
  - Clarify runtime produces Behavior Profile at runtime using lightweight binary instrumentation
  - BP is invisible to the end-user
- Machine learning technique is used for searching
  - Training & deployment phase

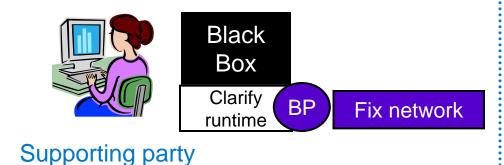




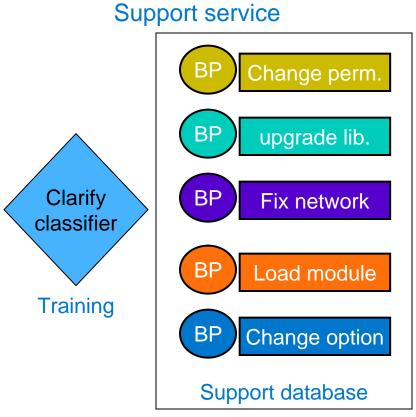


## Training the Classifier

Clarify classifier - enables search for workarounds

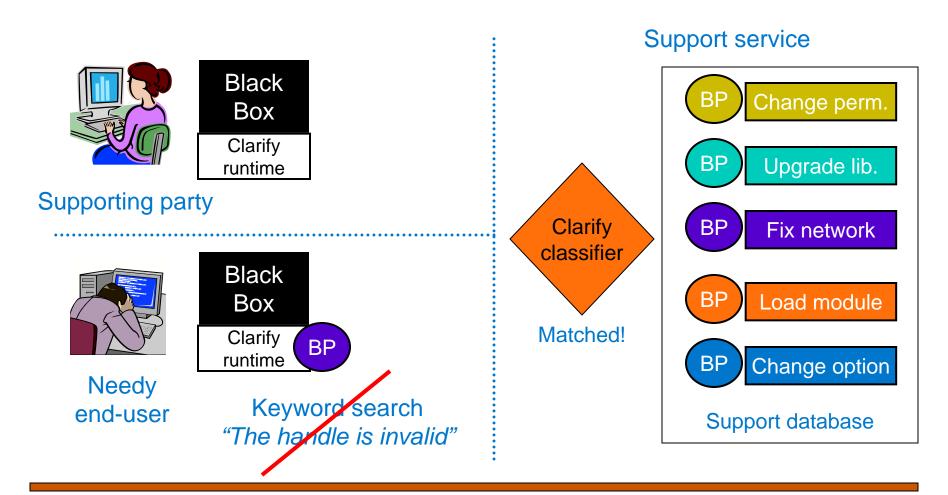


- Supporting party can be
  - Support websites Software testers, support organization
  - Open source projects Expert users
  - User forum Any user willing to share their experiences



## Clarify enabled Software Support

Clarify enables sharing workarounds and fixes among users



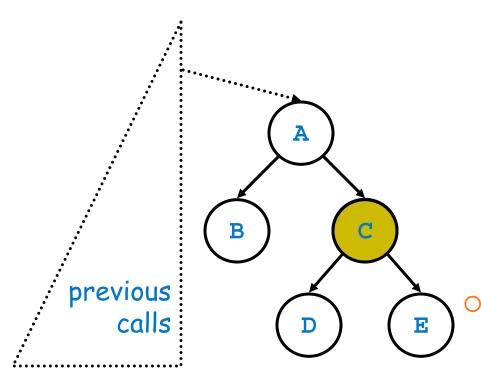
#### **Behavior Profile**

- Behavior Profile is
  - Abstraction of software global context
  - Generated by Clarify runtime
  - Any profile that contains history of software execution can be used as behavior profile
    - o e.g. Path profiling [Ball & Larus '96]
- 2 important Behavior Profile types
  - Call-Site Profiling (CSP)
    - Counter for each call-site
  - Call Tree Profiling (CTP)
    - Summary of dynamic call tree by counting subtree pattern

## Call Tree Profiling

- Idea
  - Dynamic Call Tree (DCT) represents the software behavior but it is huge
  - Call patterns have meaning
    - o e.g. foo() function that reads a file
      - Successful pattern : open(), read(), close()
      - Unsuccessful pattern : open ()
- Call Tree Profiling Summary of DCT
  - Count the call patterns of depth 2

## Call Tree Profiling



**Dynamic Call Tree** 

When c returns

C's call pattern

o (C D E)

A's call pattern

o (A B C)

 Increment counter for subtree of depth 2

(A B (C D E))

Counter is incremented on

- Function return
- Some loop back-edges

## **Deployment Scenarios**

|                     | Live<br>deployment                            | Forensic deployment |  |
|---------------------|---|---------------------|--|
| Coverage            | Unknown errors can be added to the classifier | Known errors only   |  |
| Behavior<br>Profile | Full  | Partial             |  |
| Instrumentatio<br>n | Full  | Minimal             |  |
| Runtime<br>overhead | Higher  | Lower               |  |

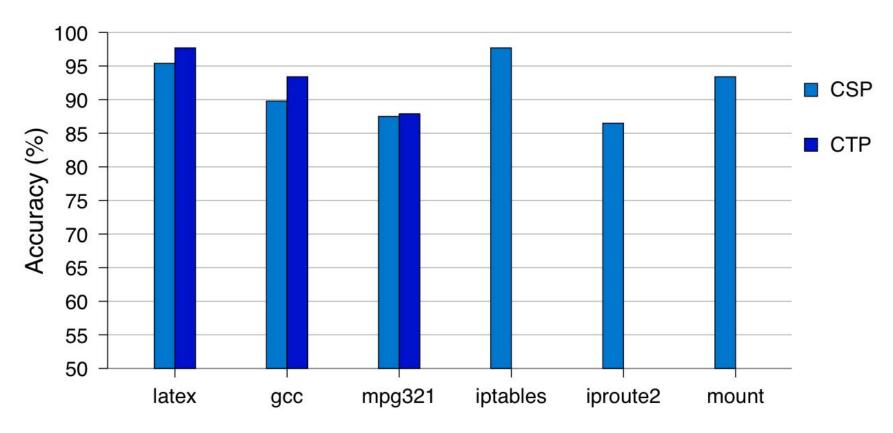
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#### Benchmarks

- Ambiguous error messages from large, popular software
  - LaTeX: "! Undefined control sequence"
    - Misspelled \foootnote
    - Duplicate \footnote
  - 4 27 ambiguous error cases per programs
  - 30 400 test inputs per each error cases
  - Clarify disambiguates error messages
- Benchmark programs
  - 3 User applications (CTP, CSP)
    - o gcc, LaTeX, mpg321
  - 3 Linux kernel modules (CSP)
    - o iptables, iproute2, nfsmount

## Classification Accuracy



- Overall high accuracy >85%
- CTP shows better accuracy than CSP
- CTP is only available for user benchmarks

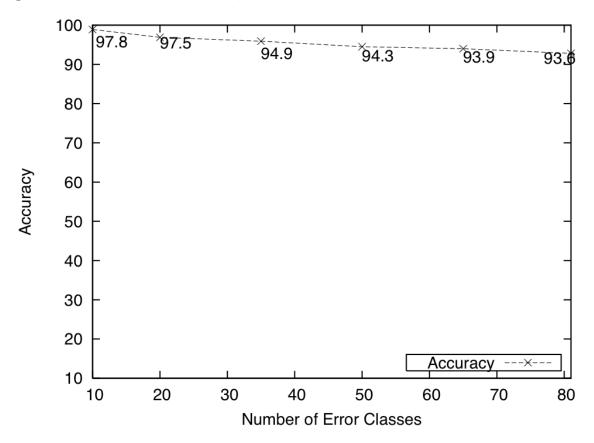
## Deployment Overhead

| Benchmark | Live |      | Forensic |      |
|-----------|------|------|----------|------|
|           | CSP  | СТР  | CSP      | СТР  |
| latex     | 5.3% | 97%  | 0.6%     | 1.1% |
| mpg321    | 1.2% | 67%  | 0.3%     | 1.3% |
| gcc       | 7.0% | 110% | 1.0%     | 9.9% |

- CSP is suitable for live deployment
- CTP is suitable for forensic deployment

#### Scalability with the Number of Error Cases

- LaTeX benchmark up to 81 error cases
  - Ambiguous error cases (27) + common latex errors (54)



Accuracy drops only 4.2% from 10 to 81 error cases

#### Related Work

- Classifying or detecting known software problems
  - [Yuan '06], [Brodie '05], [Forrest '00]
- Clustering software failure
  - [Podgurski '03]
- Markov model of software execution
  - [Bowring '04]
- Related problems
  - Isolating Misconfiguration [Wang '04]
  - Statistical Debugging [Liblit '05], [Hangal '02]

#### Conclusion

- Error reporting is an important problem
- Clarify provides a framework for error reporting
  - Improves software troubleshooting
  - Enables effective sharing of workarounds
- Clarify classifier
  - Accurately disambiguates error cases
  - Low overhead for deployment
  - Scalable with the number of error cases