



Efficiently Finding Similar Stack Traces

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Software crash



Software crash



Crash Report

```
1 Date: 2016-01-20T22:11:40.834Z
2 Product: XXXXXXXXXXXXX
3 Version: 144.3143
4 Action: null
5 OS: Mac OS X
6 Java: Oracle Corporation 1.8.0_40-release
7 Message: new child is an ancestor
8
9 java.lang.IllegalArgumentException: new child is an ancestor
10   at javax.swing.tree.DefaultMutableTreeNode.insert(DefaultMutableTreeNode.java:179)
11   at javax.swing.tree.DefaultMutableTreeNode.add(DefaultMutableTreeNode.java:411)
12   at com.openapi.application.impl.ApplicationImpl$8.run(ApplicationImpl.java:374)
   ....
41   at java.util.concurrent.ThreadPoolExecutor$Worker.run(ThreadPoolExecutor.java:617)
42   at java.lang.Thread.run(Thread.java:745)
43   at org.ide.PooledThreadExecutor$2$1.run ....
```



Triage Process

- Compare the similarity between stack traces (crash dumps)
- Group stack traces
 - **Prioritization bug fixing**: focus on the most frequent and critical issues
 - **Problem diagnosis**: complementary information about an error



TraceSim

- State-of-the-art method for comparing stack traces
- Based on *optimal global alignment*



Global Alignment

```
- - A B B B B D F  
C C A B B K - - -
```



Global Alignment Types

-	-	A	B	B	B	B	D	F
C	C	A	B	B	K	-	-	-

Alignment between an element and a gap



Global alignment

-	-	A	B	B	B	B	D	F
C	C	A	B	B	K	-	-	-

Match



Global Alignment Types

```
- - A B B B B D F  
C C A B B K - - -
```

Mismatch



Optimal Global Alignment

- Scoring scheme: define how to compute the value of each match, mismatch and gap alignments.
- Alignment score: the sum of the match values minus the sum of the values of each mismatch and gap alignment.
- Goal: find the highest alignment score



Shortcoming of TraceSim

- Time complexity of $O(n \cdot m)$
 - Expensive to deploy in industrial environments.



Our solution

- Alignment method for similarity comparison
 - Optimal global alignment is simplified
 - ① Optimally requirement removal
 - ② Frame dependency is loosed
 - Time complexity: $O(n + m)$



Our Algorithm Steps

- 1 Group the frame with same subroutine names (sorted by frame position)
- 2 Individually align each group of frames with same subroutine names
 - 1 Match frames from top positions to the bottom
 - 2 Unmatched frames are aligned to gaps



Our Algorithm Example

Q 1 2 3 4
a a c d

C 1 2 3 4 5
c c a b c



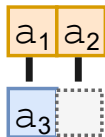
Our Algorithm Example - Step 1

Q a_1 a_2 c_3 d_4

C a_3 b_4 c_1 c_2 c_5



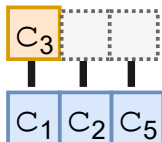
Our Algorithm Example - Step 2



Our Algorithm Example - Step 2



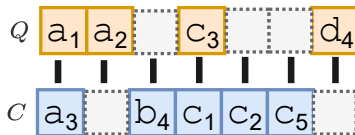
Our Algorithm Example - Step 2



Our Algorithm Example - Step 2



Our Algorithm Example - Final



Experiments

- Task: Duplicate crash reports detection
- Datasets: Netbeans, Eclipse, OpenOffice, and Gnome
- 50 different runs
- Metrics
 - ① Area Under the ROC Curve (AUC)
 - ② MAP: measure how good is our method on ranking.
 - ③ Recall Rate@1 (RR@1): percentage of queries whose the first report in the recommend list is the correct duplicate.

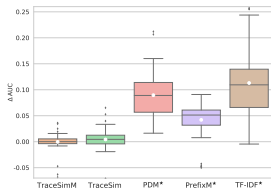
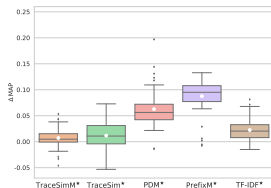
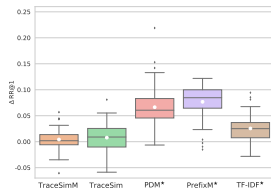


Experiments

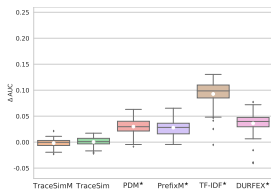
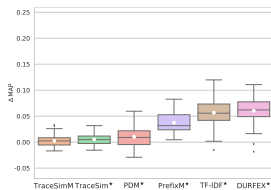
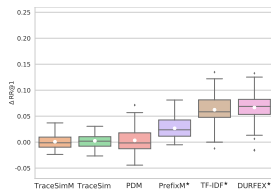
- Our algorithm is compared to five competing methods
 - Difference: ΔAUC , ΔMAP $\Delta RRR@1$
 - Wilcoxon signed-rank test: statistical significance is indicated by ★



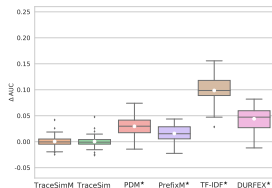
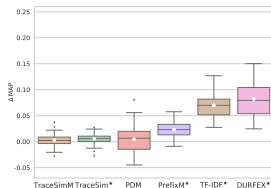
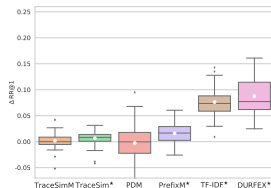
Ubuntu

(a) ΔAUC (b) ΔMAP (c) $\Delta RR@1$ 

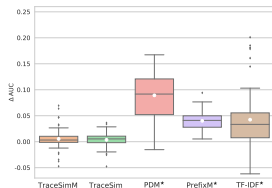
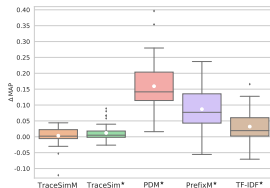
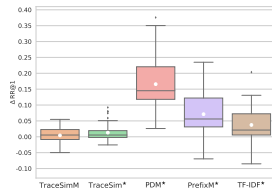
Eclipse

(a) ΔAUC (b) ΔMAP (c) $\Delta RR@1$ 

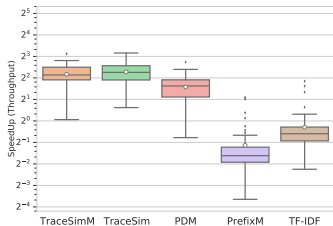
Netbeans

(a) ΔAUC (b) ΔMAP (c) $\Delta RR@1$ 

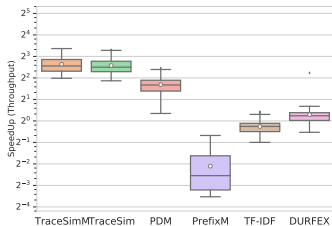
Gnome

(a) ΔAUC (b) ΔMAP (c) $\Delta RR@1$ 

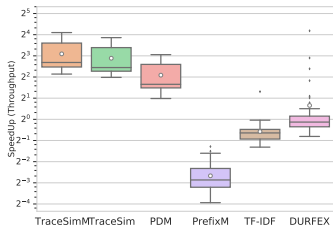
Speedup



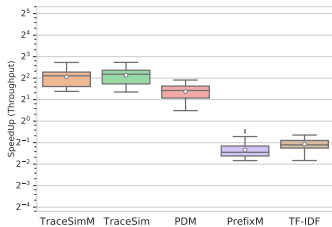
(a) Ubuntu



(b) Eclipse



(c) Netbeans



(d) Gnome

Concluding Remarks

- We propose a simple alignment method
- Our algorithm achieves state-of-art performance in all datasets
- Our algorithm is much faster than TraceSim



Thank you for your attention!
Questions?

