

Fault Localization: Incorporating normalized code length as parameter for coefficient based faulty ranking program

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Content

- Topic and key issue to be addressed
- Proposed approach and methods
- Experiment results and analysis
- Key findings

Topic & Key Issue

- Topic selected: Fault Localization
- Key issues to be addressed:
 1. Improving fault localization accuracy by investigating the importance (weights) of different testing coverage information.
 2. Improving suspiciousness scoring accuracy by leveraging syntactical feature.

Proposed approach

- Based on testing coverage information, suspiciousness factors can be divided into two categories.
 - More suspicious: N_{CF}, N_{US}
 - Less suspicious: N_{CS}, N_{UF}
- Faulty scoring formulation
 - More suspicious (A) = $N_{CF} + N_{US}$
 - Less suspicious (B) = $N_{CS} + N_{UF}$
 - $Score = \alpha A - \beta B$
- Adding syntactical feature L (statement length)
 - Refined score = $\alpha A - \beta B + \gamma L$

Methods

1. Data preprocessing to extract required features for each Java Program in the evaluation set.

Example: time1

```
5
org.joda.time.Partial#221 F
org.joda.time.field.UnsupportedDurationField#227 F
org.joda.time.field.UnsupportedDurationField#228 F
org.joda.time.field.UnsupportedDurationField#229 F
org.joda.time.Partial#217 T
org.joda.time.Chronology#63 3432 1 513 0 5
org.joda.time.DateTimeField#33 3526 1 419 0 5
org.joda.time.DateTimeFieldType#41 30 0 3915 1 7
org.joda.time.DateTimeFieldType#73 3528 1 417 0 8
```

Methods

2. Compute the normalized value of each feature
3. Calculate the suspiciousness score for each line of code
4. Compute the suspiciousness ranking and Exam Score

Experiment Results & Analysis

Performance without weight: $A - B + L$

	Proposed	Dstar	Jaccard
1 'chart19.txt'	0.193462308	0.000667111	0.241827885
2 'closure1.txt'	0.006813075	0.008407625	0.267739364
3 'closure10.txt'	0.015508622	0.013570044	0.258953168
4 'closure100.txt'	0.0183161	0.009748892	0.484194978
5 'closure101.txt'	0.67875383	0.352400409	0.018215867
6 'closure102.txt'	0.523537415	0.514829932	0.240816327
7 'closure103.txt'	0.984585742	0.444123314	0.19894027
8 'closure104.txt'	0.00310559	0.003992902	0.283496007
9 'closure105.txt'	0.009294466	0.020490072	0.396915927
10 'closure106.txt'	0.118925831	0.016943734	0.408407928
11 'closure107.txt'	0.013057546	0.013173099	0.48648024
12 'closure109.txt'	0.003916193	0.000783239	0.241237517
13 'closure11.txt'	0.114109763	0.053251223	0.310994385
14 'closure110.txt'	0.906006006	0.781181181	0.78048048
15 'closure112.txt'	0.001639486	0.006989386	0.416774528
16 'closure113.txt'	0.001757469	0.001318102	0.289762742
17 'closure115.txt'	0.015403235	0.010122126	0.386731214
18 'closure116.txt'	0.000287991	0.000671978	0.327541519
19 'closure117.txt'	0.741925091	0.755376561	0.754722179
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⋮			
⋮			
136 'time4.txt'	0.002604167	0.010416667	0.524553571
137 'time5.txt'	0.679693795	0.601128122	0.601128122
138 'time6.txt'	0.025623736	0.039447067	0.302090357
139 'time7.txt'	0.006245496	0.003843382	0.370405957
140 'time8.txt'	0.345534407	0.324304539	0.324304539
141 'time9.txt'	0.029304029	0.021245421	0.260805861

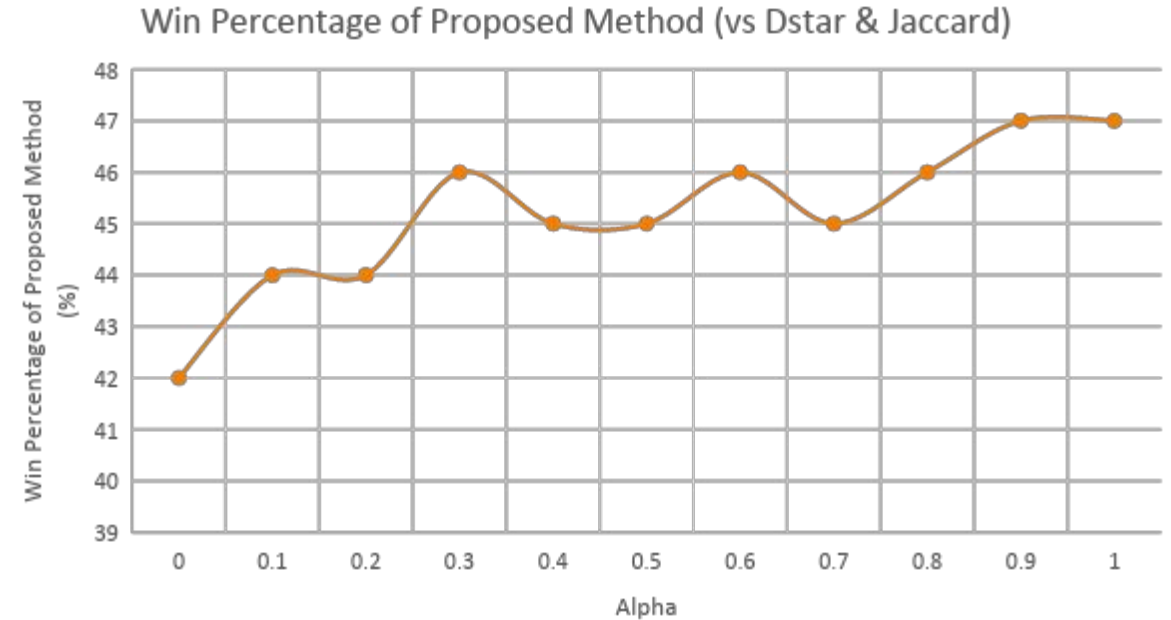
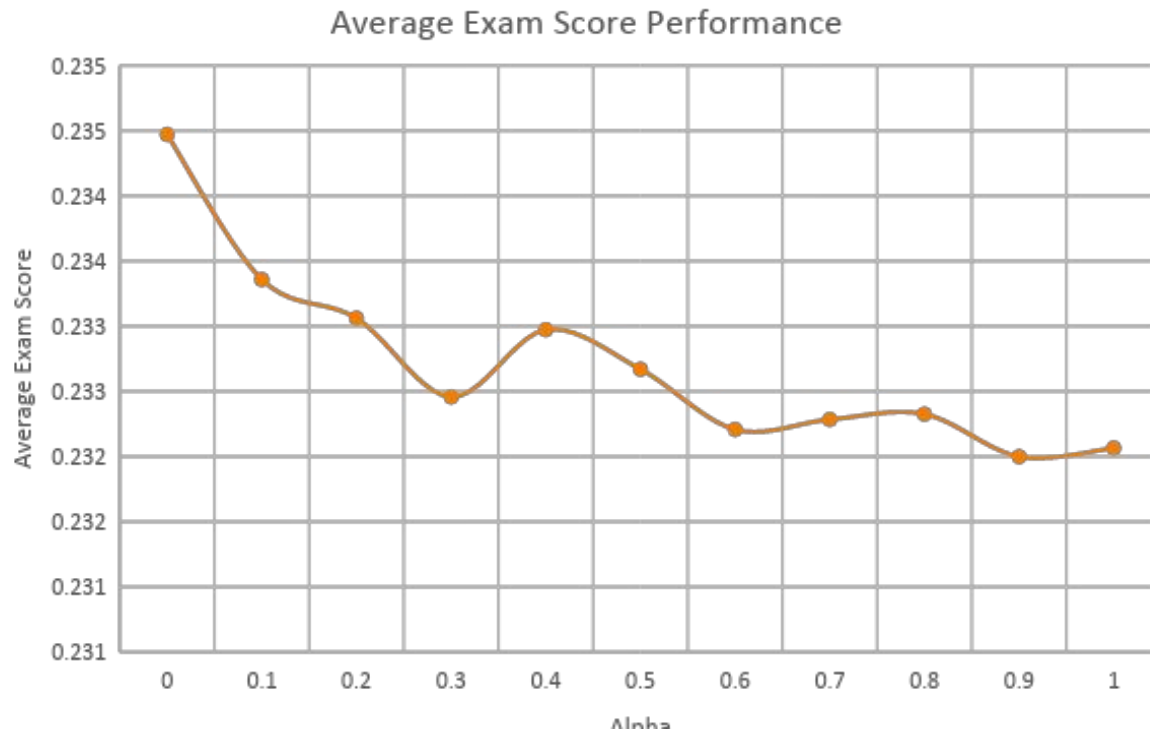
RESULT

Comparison	Method	Number of Wins	Win Percentage
The best overall	Proposed Method	61	44%
	Dstar	66	47%
	Jaccard	10	7%
	Tie	3	2%
Proposed vs Dstar	Proposed Method	63	45%
	Dstar	75	53%
	Tie	3	2%
Proposed vs Jaccard	Proposed Method	111	79%
	Jaccard	29	21%
	Tie	1	1%

Experiment Results & Analysis

The significance of weight of each parameter

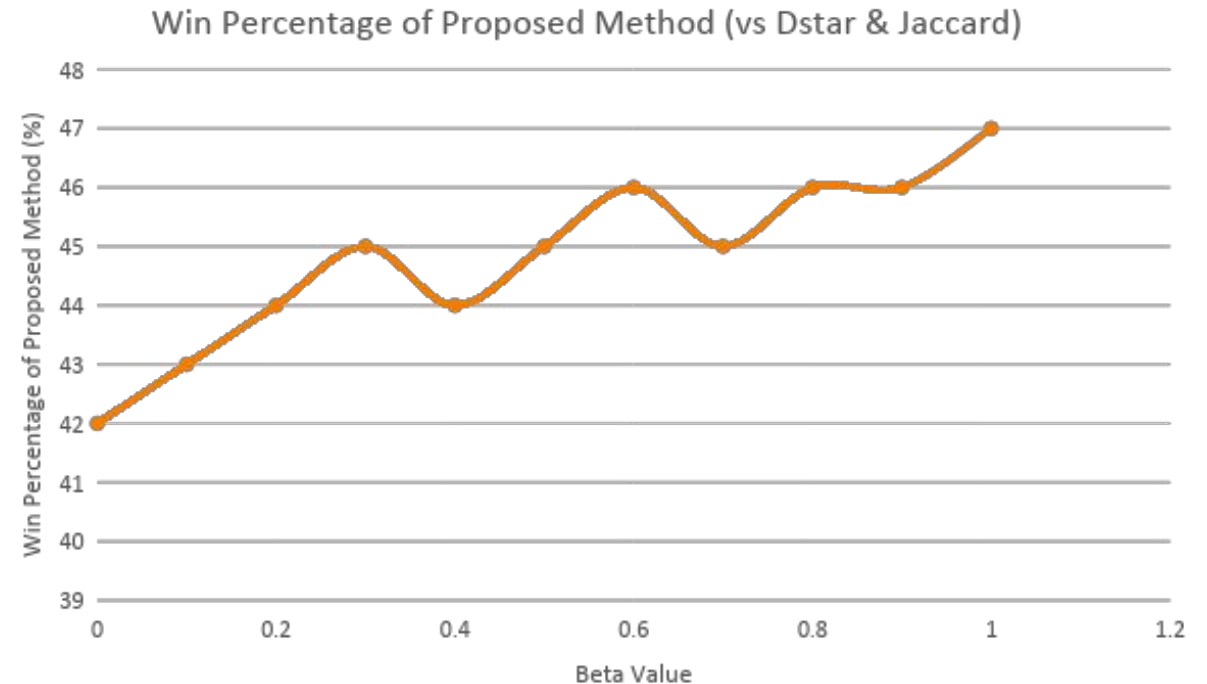
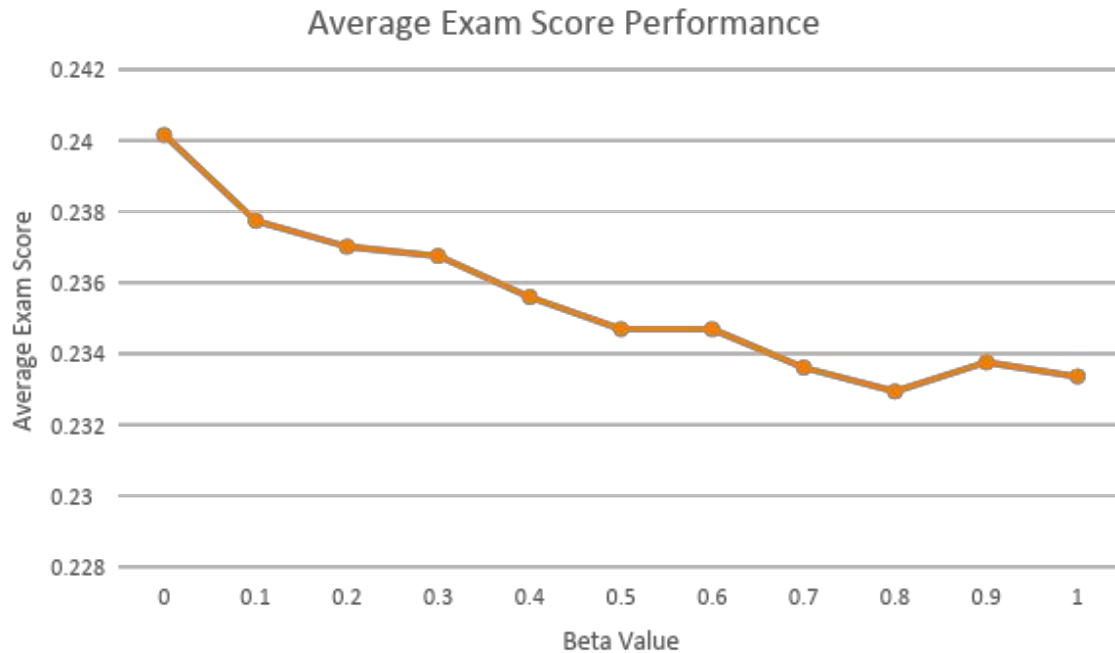
$$\alpha A + \beta B + \gamma L$$



Experiment Results & Analysis

The significance of weight of each parameter

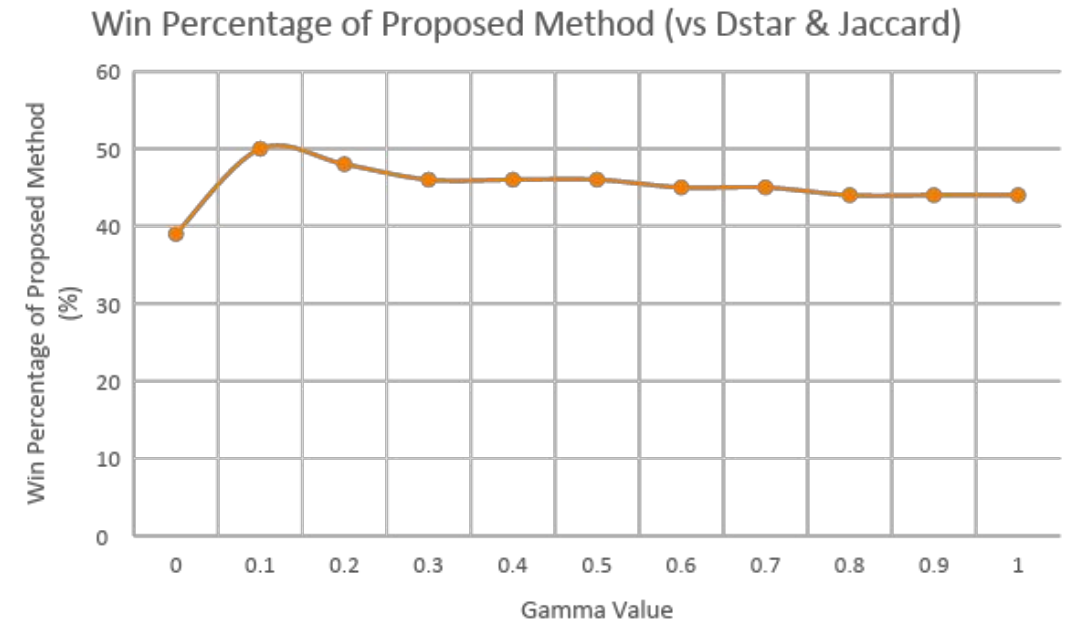
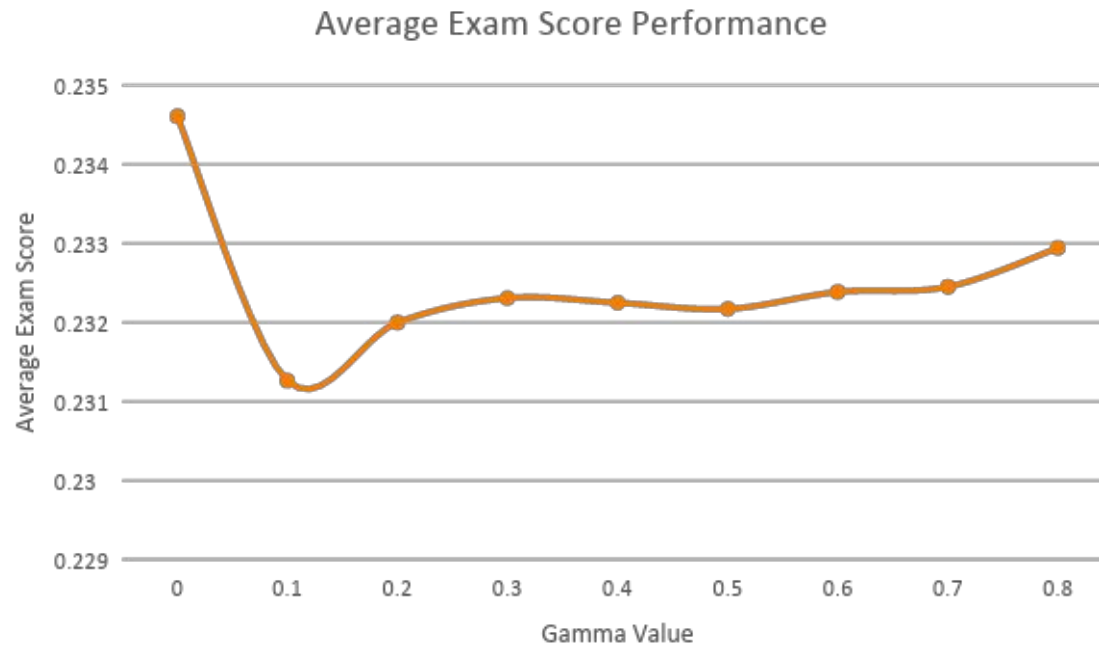
$$\alpha A - \beta B + \gamma L$$



Experiment Results & Analysis

The significance of weight of each parameter

$$\alpha A - \beta B + \gamma L$$



Experiment Results & Analysis

The threshold of parameter setting

Based on those exploration, we get a rule of Parameter Setting

1. Higher α , higher performance.
 2. Higher β , higher performance.
 3. The optimum performance of γ at 0.1
- By iterating each parameter based on that rule, we define threshold setting at $\alpha = 0.9$; $\beta = 0.9$; $\gamma = 0.1$.
 - This is the minimum required setting to met Dstar performance.

Experiment Results & Analysis

Performance comparison with Jaccard and Dstar

$$\alpha = 0.9; \beta = 0.9; \gamma = 0.1$$

Increase only 0.1



$$\alpha = 1; \beta = 1; \gamma = 0.1$$

RESULT

Comparison	Method	Number of Wins	Win Percentage
The best overall	Proposed Method	69	49%
	Dstar	59	42%
	Jaccard	11	8%
	Tie	1	1%
Proposed vs Dstar	Proposed Method	70	50%
	Dstar	70	50%
	Tie	1	1%
Proposed vs Jaccard	Proposed Method	111	79%
	Jaccard	29	21%
	Tie	1	1%

RESULT

Comparison	Method	Number of Wins	Win Percentage
The best overall	Proposed Method	72	51%
	Dstar	56	40%
	Jaccard	11	8%
	Tie	1	1%
Proposed vs Dstar	Proposed Method	73	52%
	Dstar	67	48%
	Tie	1	1%
Proposed vs Jaccard	Proposed Method	112	79%
	Jaccard	28	20%
	Tie	1	1%

Experiment Results & Analysis

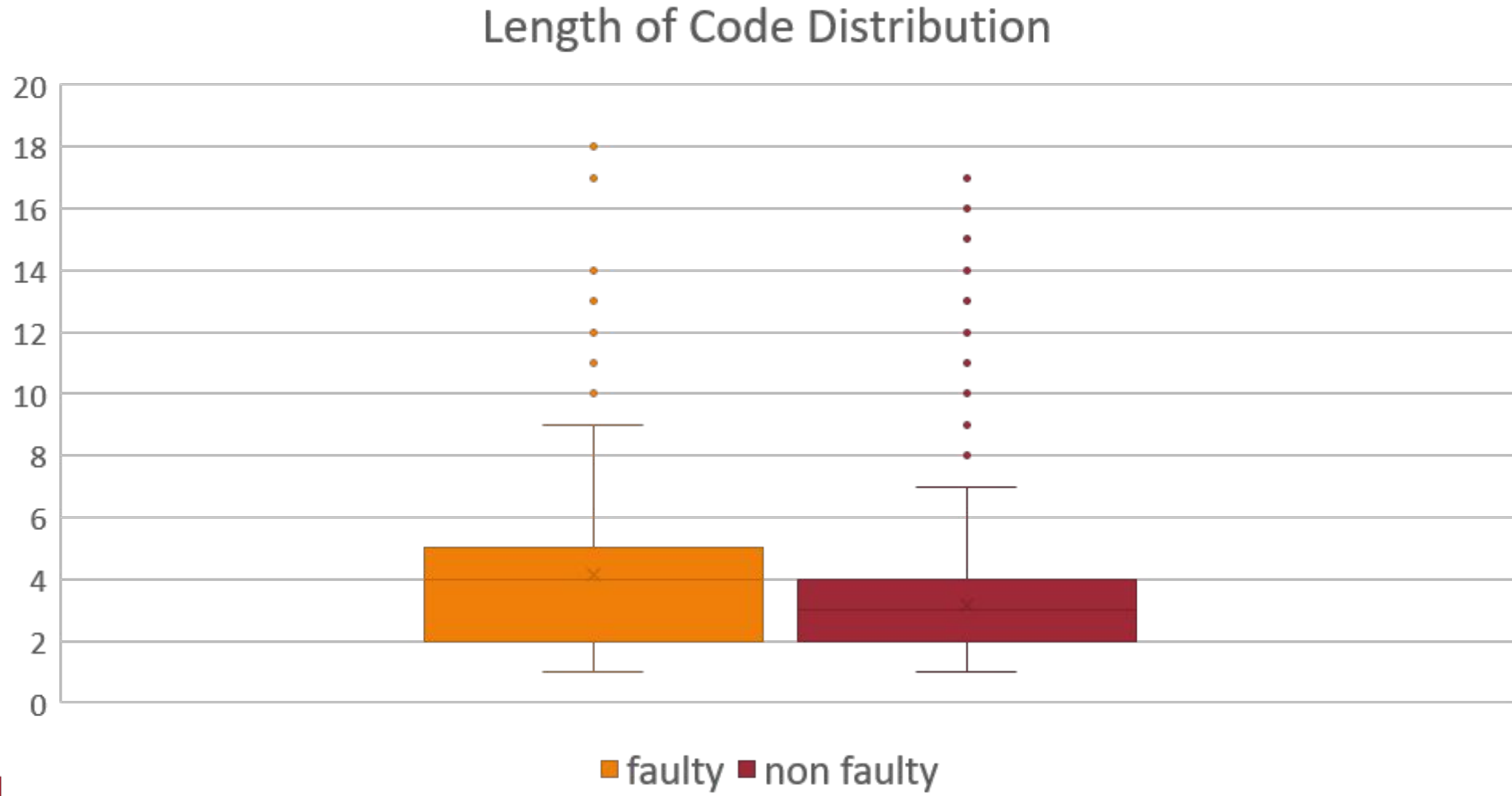
Ablation Study

	Proposed	Dstar	Without Length
1 'chart19.txt'	0.152101401	0.000667111	0.133755837
2 'closure1.txt'	0.007392912	0.008407625	0.008335145
3 'closure10.txt'	0.011835527	0.013570044	0.013570044
4 'closure100.txt'	0.011225997	0.009748892	0.210044313
5 'closure101.txt'	0.632107593	0.352400409	0.652400409
6 'closure102.txt'	0.518639456	0.514829932	0.524829932
7 'closure103.txt'	0.975313102	0.444123314	0.973747592
8 'closure104.txt'	0.002218279	0.003992902	0.003992902
▪ ▪ ▪			
134 'time27.txt'	0.111111111	0.116421569	0.116421569
135 'time3.txt'	0.762943787	0.542159763	0.600221893
136 'time4.txt'	0.005952381	0.010416667	0.010416667
137 'time5.txt'	0.669621273	0.601128122	0.667203868
138 'time6.txt'	0.009777478	0.039447067	0.010114633
139 'time7.txt'	0.004083594	0.003843382	0.003843382
140 'time8.txt'	0.321376281	0.324304539	0.485358712
141 'time9.txt'	0.022710623	0.021245421	0.021245421

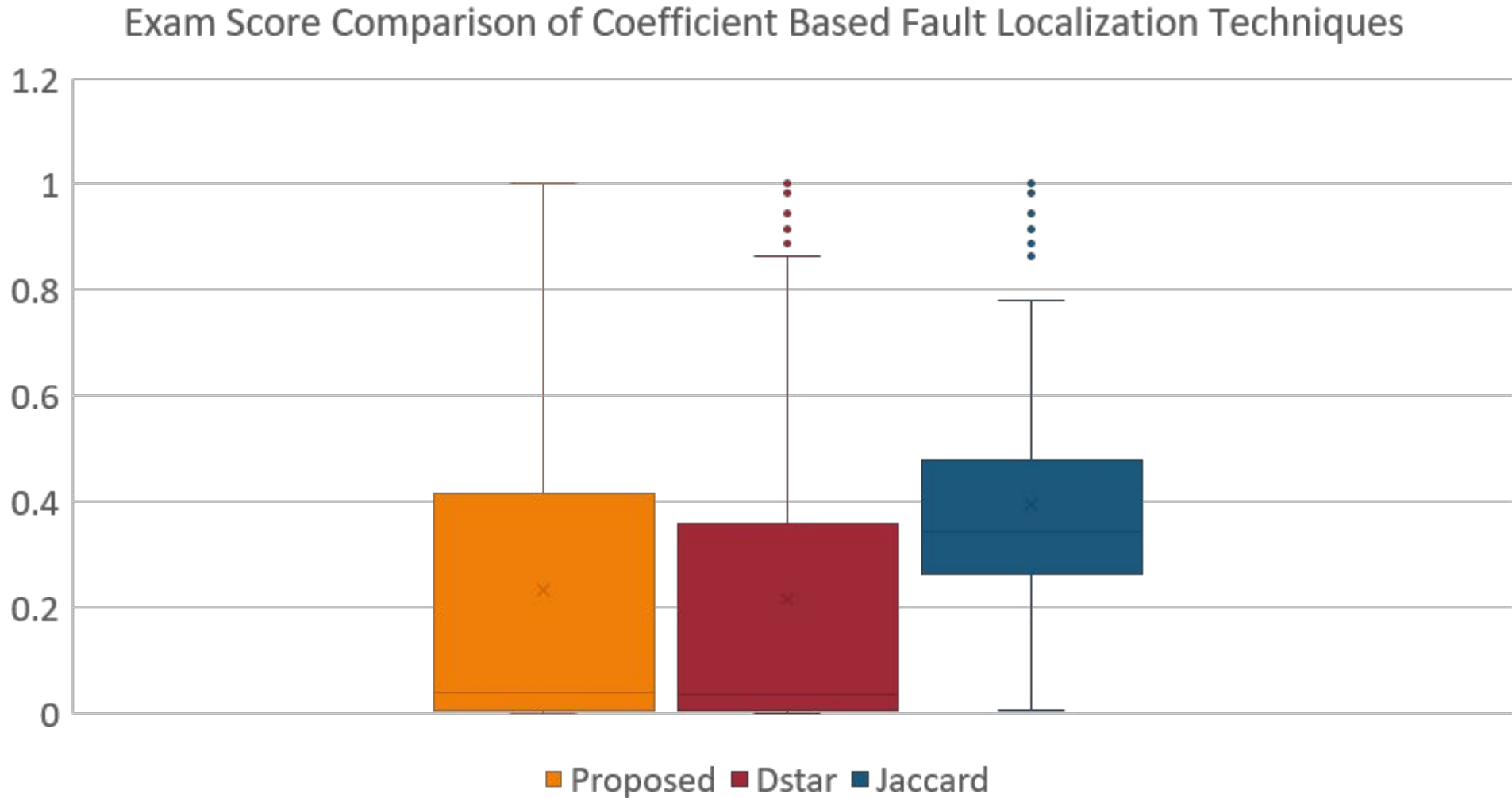
RESULT

Comparison	Method	Number of Wins	Win Percentage
Proposed vs Without Length	Proposed Method	78	55%
	Without Length	55	39%
	Tie	8	6%
Proposed vs Dstar	Proposed Method	73	52%
	Dstar	67	48%
	Tie	1	1%
Without Length vs Dstar	Without Length	52	37%
	Dstar	75	53%
	Tie	14	10%

Experiment Results & Analysis



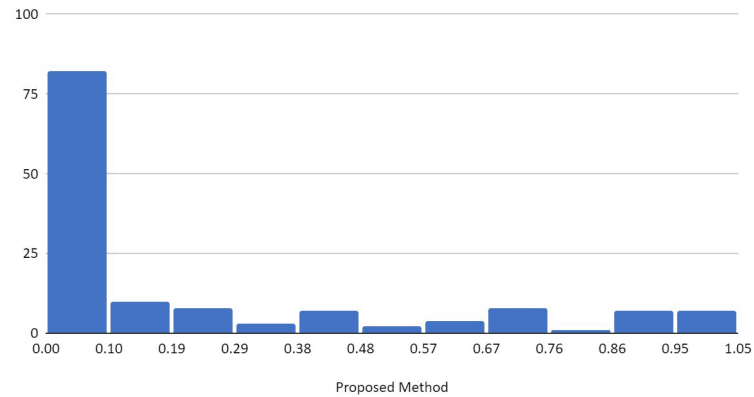
Experiment Results & Analysis



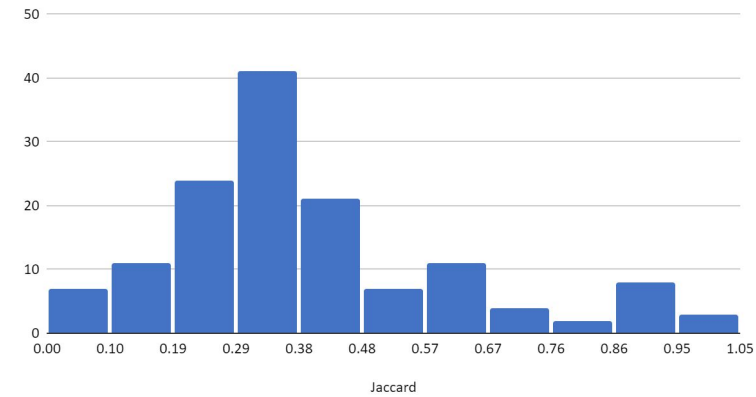
Experiment Results & Analysis

- From the histogram we can see that the Exam score variance is 1 with mean close to 0

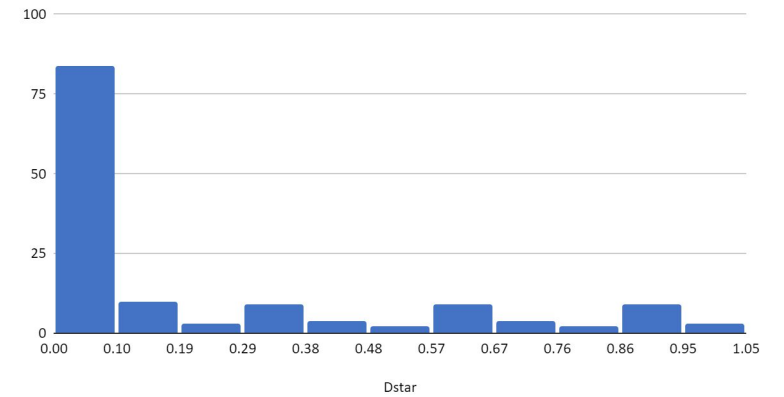
Histogram of Exam Score



Histogram of Exam Score



Histogram of Exam Score



Experiment Results & Analysis

- t-Test: Proposed vs Jaccard

	<i>Proposed</i>	<i>Jaccard</i>
Mean	0.2314	0.3952
Variance	0.1072	0.0509
Observations	141	141
Hypothesized Mean Difference	0	
df	140	
Alpha	0.05	
P(T<=t) one-tail	1.2576E-11	
P(T<=t) two-tail	2.5152E-11	

Experiment Results & Analysis

- t-Test: Proposed vs DStar

	<i>Proposed</i>	<i>DStar</i>
Mean	0.2314	0.2147
Variance	0.1072	0.0934
Observations	141	141
Hypothesized Mean Difference	0	
df	140	
Alpha	0.05	
P(T<=t) one-tail	0.124515	
P(T<=t) two-tail	0.24903	

Key Findings

- The syntactical feature length helps in improving the fault localization performance.
- The proposed method outperforms Jaccard in all parameters setup.
- The proposed method reaches Dstar performance with threshold parameter setting ($\alpha = 0.9$; $\beta = 0.9$; $\gamma = 0.1$)

Public Repository

<https://github.com/archive05/fault-localization>