

Photo by Osamu Mizuno

ribute value lic void attribute( String attrName if ( value == null ) return; checkAttribute( ); assert elementActive; assert etementActive; out.print(""); //\$NON-NLS-out.print( attrName ); out.print( "= ); //\$NON-NI // Scan the string character // characters that must be h int len = value.length();
for ( int i = 0; i < len; i</pre> char c = value.charA if ( c ==

LICERSIPE.

A Fault-Prone Module Detection Using a Spam Filter

#### **Fault-prone Filtering**

- Fault-prone module detection using a spam filtering approach[1][2]
  - Uses frequency of terms like spam e-mail filtering
    - Constructs both faulty and non-faulty corpuses from past modules
    - Classifies an unknown module using two corpuses

O. Mizuno and T. Kikuno, "Training on Errors Experiment to Detect Fault-Prone Software Modules by Spam Filter," In The 6th joint meeting of the European Software Engineering Conference and the ACM SIGSOFT Symposium on the Foundations of Software Engineering (ESEC/FSE2007), pp. 405-414, September 2007. (Dubrovnik, Croatia)
 O. Mizuno, S. Ikami, S. Nakaichi, and T. Kikuno, "Spam Filter Based Approach for Finding Fault-Prone Software Modules," in Proc. of Fourth International Workshop on Mining Software Repositories (MSR'07), p. 4, May 2007. (Minneapolis, MN, USA)

# How It Works (Training)

**1.** Training faulty and non-faulty modules using Tokenizer.



# **How It Works (Prediction)**

2. Calculating probability by the Bayesian filter.



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#### Experiment: Result of Prediction

Eclipse (random sample)		Predicted		
		NFP	FP	
Actual	not faulty	12,249	7,093	
	faulty	2,972	16,243	

Precision: 0.696 Recall: 0.845

Eclipse BIRT (all modules)		Predicted		
		NFP	FP	
Actual	not faulty	70,349	16,011	
	faulty	2,039	7,501	

Precision: 0.319 Recall: 0.786





Apply software modules to fault-prone filter in order of construction and modification.

Only misclassified modules are trained in corpuses.

#### **Successive Prediction (TOE)**

## Fault-proneness filtering with static code analysis





## Result



Photo by thenys www.freeimages.com

## **Analysis of Identifiers**

NAME

RHI

BLU



# What we did

We investigated the frequency of appearance of identifiers in source code modules from the viewpoint of the length of identifiers in Eclipse and NetBeans.

We modelled the relationship between the length of identifiers and the fault-proneness.

We used the random forest for the modelling.

Data used:

Frequency of identifier's occurrence for each file grouped by the length of identifier + faulty status by SZZ

<u>Kimiaki Kawamoto</u> and <u>Osamu Mizuno</u>, "<u>Do Long Identifiers Induce Faults in Software? --- a Repository</u> <u>Mining Based Investigation ---</u>," In Proc. of 22nd International Symposium on Software Reliability Engineering (ISSRE2011), Supplemental proceedings, 3-1, November 2011. (Hiroshima, Japan)

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#### **Results of analysis**

**Table 2**Evaluation of prediction (average of 10 times)

	Accuracy	Precision	Recall	F-Measure
Eclipse	0.888	0.866	0.913	0.889
Netbeans	0.850	0.765	0.865	0.812

**Table 3**Top 10: Mean Decrease Gini (average of 10 times)

Lengths of 3, 4, and 7 have impact for faultproneness.

		Eclipse	Netbeans		
Rank	Length	Mean decrease Gini	Length	Mean decrease Gini	
1	7	7767.47	3	7505.82	
2	4	6501.14	4	6537.75	
3	8	6146.32	10	6505.30	
4	3	5643.99	7	6187.07	
5	13	5378.26	6	6109.80	
6	6	5073.66	11	5342.15	
7	9	4883.39	9	5176.19	
8	5	4664.90	8	5156.06	
9	11	4200.25	14	4900.95	
10	14	4140.85	13	4653.10	

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# [FYI] The longest identifiers

#### In Eclipse: 237 characters, appears 26 times

WorkingDirectoryStatusHandler\_Eclipse\_is\_not\_able\_to\_set\_the\_working\_directory\_ specified\_by\_the\_program\_being\_launched\_as\_the\_current\_runtime\_does\_not\_sup port\_working\_directories\_\_nContinue\_launch\_without\_setting\_the\_working\_director y\_2

#### In Netbeans: 210 characters, appears 76 times

getCustomResourceOrExternalJndiResourceOrJdbcResourceOrMailResourceOrPer sistenceManagerFactoryResourceOrAdminObjectResourceOrConnectorResourceOr ResourceAdapterConfigOrJdbcConnectionPoolOrConnectorConnectionPool



Do code review activities become more productive in Gerrit-based projects as a result of evolution?

# Mining code review repositories

Photo by Paul Barker (www.freeimages.com)

# **Data collection tool (Developed)**

Integrated crawling and mining tool [1].

Developed by Junwei Liang (a master course student)



[1] JunWei Liang and Osamu Mizuno, "Analyzing Involvements of Reviewers Through Mining a <u>Code Review Repository</u>," In Proc. of the Joint Conference of the 21th International Workshop on Software Measurement and the 6th International Conference on Software Process and Product Measurement (IWSM/MENSURA2011), pp. 126-132, November 2011. (Nara, Japan)



### **Ratio of activities in review process**



# Discussion time and approval

- In Rietveld, the number of LGTM is proportional to the discussion time.
- In Gerrit, +2 labeled issues quickly finish discussion.

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