

Efficient analysis of Defects using Naïve Bayes Classification and Impact on Effort and Cost of the Project

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Abstract

Research work focuses on impact of defects identified in various stages of Software Development Life Cycle (SDLC) on overall project effort and cost. Naïve Bayes classification technique is used to identify the bug tracking, discovery and maintenance of risky modules. Statistical analysis is performed for analyzing the impact on effort and cost of a project. In this paper, bug tracking is represented as a variable of severity which can be analyzed based on classification and can be displayed high posterior in plot on defect stage in each phase.

Keywords: SLDC Defects, Predict Cost Variance, Naïve Bayes classification, Statistical analysis, Impact, Severity

INTRODUCTION

Naïve Bayes classification technique can be used to identify the defect of project management stage to discover and maintenance of risky modules. In this paper, defect tracking represents as the variable of severity class label which can be analysed based on classification can be displayed high posterior in plot on defect stage in each phases. Also statistical

analysis can be performed for analysed impact on effort and cost of a project.

This research work focuses on classifying defects based on phase detected and severity. Effort required for fixing the defects, is predicted using pre-defined values. Cost impact is calculated based on the defect detected Phase. Implementation of probability theory, Naïve Bayes classifier can check the condition rule, decision making deals with probability inference which is used to gather the knowledge of prior events by predicting events through rule base and classifies using learning phase and testing phase.

Data for Research- Defect Collection from various stages of Software Development Life Cycle (SDLC)

In this research work, Defects from Requirements, Design, Build, System Test, User Acceptance Test (UAT) and Implementation stages are listed for analyzing. The defects classified are based on Phase Detected and Phase Attributed which are assigned a weight based on Phase Detected and Severity. The collection of data can be represented as in table.1 and table.2

Table 1: Collection of Requirements and design defects

| Defect | Phase Detected | Phase Attributed | Impact | Weight | Severity |
|---|----------------|------------------|--------|--------|----------|
| Ambiguous Requirements | Requirements | Requirements | 10% | 1 | Minor |
| Inadequate Requirements | Requirements | Requirements | 10% | 1 | Minor |
| Incorrect Requirements | Requirements | Requirements | 10% | 1 | Minor |
| Missing Requirements | Requirements | Requirements | 10% | 1 | Minor |
| Ambiguous Design | Design Review | Design | 10% | 1 | Minor |
| Boundary Conditions Neglected in Design | Design Review | Design | 10% | 1 | Minor |
| Data error | Design Review | Design | 10% | 1 | Minor |
| Database Error | Design Review | Design | 10% | 1 | Minor |
| Incorrect Design | Design Review | Design | 10% | 1 | Minor |
| Inadequate Design | Design Review | Design | 10% | 1 | Minor |
| Sub optimal Design | Design Review | Design | 10% | 1 | Minor |
| Message Error | Design Review | Design | 10% | 1 | Minor |
| Missing Design | Design Review | Design | 10% | 1 | Minor |
| Test Plan / Cases Error | Design Review | Design | 10% | 1 | Minor |
| Ambiguous Requirements | Design Review | Requirements | 25% | 2.5 | Moderate |
| Inadequate Requirements | Design Review | Requirements | 25% | 2.5 | Moderate |
| Incorrect Requirements | Design Review | Requirements | 25% | 2.5 | Moderate |
| Missing Requirements | Design Review | Requirements | 25% | 2.5 | Moderate |

Table 2: Collection of code review and unit testing defects

| Defect | Phase Detected | Phase Attributed | Impact | Weight | Severity |
|---|----------------------------|------------------|--------|--------|----------|
| Computational Error | Code Review & Unit Testing | Coding | 10% | 1 | Minor |
| Boundary Conditions Neglected in Code | Code Review & Unit Testing | Coding | 10% | 1 | Minor |
| Interface Error | Code Review & Unit Testing | Coding | 10% | 1 | Minor |
| Logic Error | Code Review & Unit Testing | Coding | 10% | 1 | Moderate |
| Navigation Error | Code Review & Unit Testing | Coding | 10% | 1 | Minor |
| Performance Error | Code Review & Unit Testing | Coding | 10% | 1 | Moderate |
| Sequencing / Timing Error | Code Review & Unit Testing | Coding | 10% | 1 | Moderate |
| Missing / Inadequate Standards in Code | Code Review & Unit Testing | Coding | 10% | 1 | Minor |
| Typographical Error | Code Review & Unit Testing | Coding | 10% | 1 | Minor |
| Variable Declaration Error | Code Review & Unit Testing | Coding | 10% | 1 | Minor |
| Ambiguous Design | Code Review & Unit Testing | Design | 25% | 2 | Moderate |
| Boundary Conditions Neglected in Design | Code Review & Unit Testing | Design | 25% | 2 | Moderate |
| Data error | Code Review & Unit Testing | Design | 25% | 2 | Moderate |
| Database Error | Code Review & Unit Testing | Design | 25% | 2 | Moderate |
| Incorrect Design | Code Review & Unit Testing | Design | 25% | 2 | Moderate |
| Inadequate Design | Code Review & Unit Testing | Design | 25% | 2 | Moderate |
| Sub optimal Design | Code Review & Unit Testing | Design | 25% | 2 | Moderate |
| Message Error | Code Review & Unit Testing | Design | 25% | 2 | Moderate |
| Missing Design | Code Review & Unit Testing | Design | 25% | 2 | Moderate |
| Test Plan / Cases Error | Code Review & Unit Testing | Design | 25% | 2 | Moderate |
| Ambiguous Requirements | Code Review & Unit Testing | Requirements | 50% | 5 | Moderate |
| Inadequate Requirements | Code Review & Unit Testing | Requirements | 50% | 5 | Moderate |
| Incorrect Requirements | Code Review & Unit Testing | Requirements | 50% | 5 | Moderate |
| Missing Requirements | Code Review & Unit Testing | Requirements | 50% | 5 | Moderate |

Similarly, defects detected in the System Testing, User Acceptance Testing, Implementation and Post Implementation stages are assigned accordingly as Weight and Severity.

METHODOLOGY

Naïve Bayes Classifier

The attributes are conditionally independent to one another by the given class label of the tuple which predicts the data in tuple where X belongs to the class C_i .

$$P(C_i | X) > P(C_j | X) \text{ for } 1 \leq j \leq m, j \neq i \quad (1)$$

By Bayes' theorem, the classic for which $P(C_i | X)$ represents maximum posterior hypothesis

$$P(C_i | X) = P(X|C_i) P(C_i) / P(X) \quad (2)$$

The probability can easily estimate by $P(x_1|C_i) \times P(x_2|C_i) \times \dots \times P(x_n|C_i)$ from the training tuples by the relationship as given below,

$$P(X|C_i) = \prod_{k=1}^n P(x_k|C_i) \quad (3)$$

In this paper, to classify the target value of defect on each stage of SDLC by using the rule theorem of equation (1) and found the maximum posteriori of defect in each phase.

An input of numerical variables can be transformed to their categorical counterparts before constructing the frequency tables. In this paper, an implementation is worked out by WEKA tool. Probability of each phase is analyzed based on the severity variables such as Major, Moderate and Minor.

STATISTICAL ANALYSIS

From Table.3, represents the estimation matrix of effort to fix the Minor, Moderate and Major Defects detected in various stages.

Table 3: Estimation Matrix of Effort to fix defects in various stages of SDLC

| Defect | Phase Detected | Min Defects | | | Mod Defects | | | Maj Defects | | |
|-----------------------|--------------------------------------|-------------|------------------|----|-------------|------------------|----|-------------|------------------|-----|
| | | Effort / FP | Change in Effort | | Effort / FP | Change in Effort | | Effort / FP | Change in Effort | |
| Requirements Defect | Requirements | 1 | 4 | 4 | 1 | 8 | 8 | 1 | 16 | 16 |
| Requirements Defect | Design Review | 1 | 10 | 10 | 1 | 20 | 20 | 1 | 40 | 40 |
| Requirements Defect | Code Review & Unit Testing | 1 | 20 | 20 | 1 | 40 | 40 | 1 | 80 | 80 |
| Requirements Defect | System Testing | 1 | 24 | 24 | 1 | 48 | 48 | 1 | 96 | 96 |
| Requirements Defect | User Acceptance Testing | 1 | 32 | 32 | 1 | 64 | 64 | 1 | 128 | 128 |
| Requirements Defect | Implementation & Post Implementation | 1 | 40 | 40 | 1 | 80 | 80 | 1 | 160 | 160 |
| Design Defect | Design Review | 1 | 4 | 4 | 1 | 8 | 8 | 1 | 16 | 16 |
| Design Defect | Code Review & Unit Testing | 1 | 8 | 8 | 1 | 16 | 16 | 1 | 32 | 32 |
| Design Defect | System Testing | 1 | 20 | 20 | 1 | 40 | 40 | 1 | 80 | 80 |
| Design Defect | User Acceptance Testing | 1 | 30 | 30 | 1 | 60 | 60 | 1 | 120 | 120 |
| Design Defect | Implementation & Post Implementation | 1 | 40 | 40 | 1 | 80 | 80 | 1 | 160 | 160 |
| Coding Defect | Code Review & Unit Testing | 1 | 4 | 4 | 1 | 8 | 8 | 1 | 16 | 16 |
| Coding Defect | System Testing | 1 | 10 | 10 | 1 | 20 | 20 | 1 | 40 | 40 |
| Coding Defect | User Acceptance Testing | 1 | 20 | 20 | 1 | 40 | 40 | 1 | 80 | 80 |
| Coding Defect | Implementation & Post Implementation | 1 | 30 | 30 | 1 | 60 | 60 | 1 | 120 | 120 |
| Implementation Defect | Implementation & Post Implementation | 1 | 20 | 20 | 1 | 40 | 40 | 1 | 80 | 80 |

From fig.1 to fig. 4 represents the effort required to fix the defects based on severity from each Phase of SDLC.

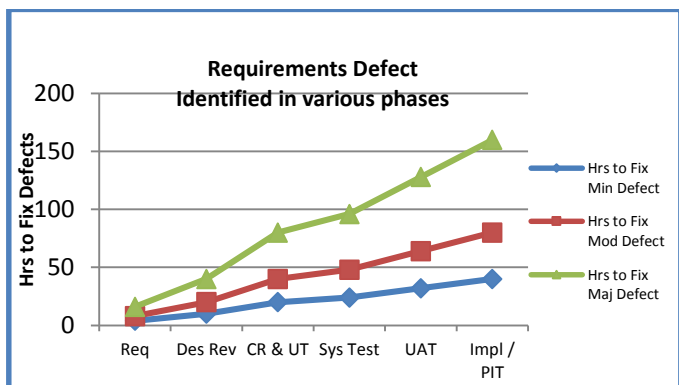


Figure 1: Effort to fix Requirements defects

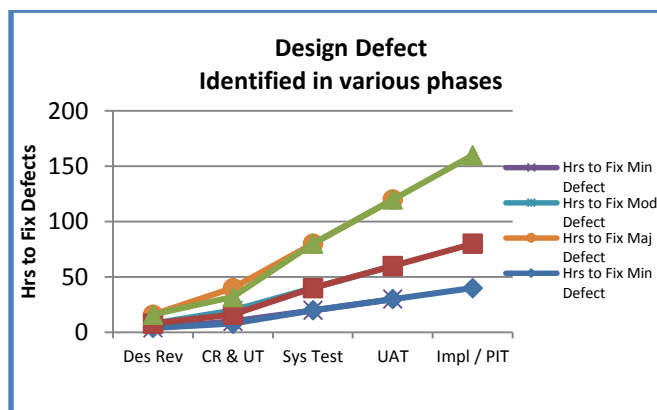


Figure 3: Effort to fix Coding defects

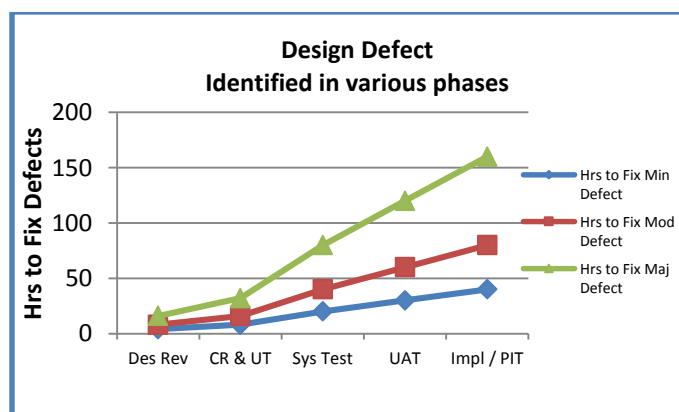


Figure 2: Effort to fix Design defects

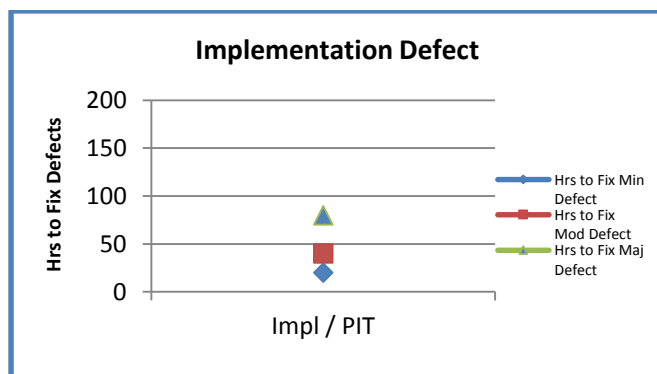


Figure 4: Effort to fix Implementation Defects

RESULT ANALYSIS

Impact of Defects identified in various stages on Cost

Tables 4 and 5 represent the impact of the change in effort and cost can be predicted based on the defects detected in various stages of SDLC cycle.

Table 4: Requirement Defect detected in the requirement stage

| Defect | Phase Detected | Min Defects | Effort / FP | Change in Effort | Mod Defects | Effort / FP | Change in Effort | Maj Defects | Effort / FP | Change in Effort | Change in Effort |
|---|--------------------------------------|-------------|-------------|------------------|-------------|-------------|------------------|-------------|-------------|------------------|------------------|
| Requirements Defect | Requirements | 4 | 4 | 16 | 2 | 8 | 16 | 1 | 16 | 16 | 48 |
| Requirements Defect | Design Review | | 10 | 0 | | 20 | 0 | | 40 | 0 | 0 |
| Requirements Defect | Code Review & Unit Testing | | 20 | 0 | | 40 | 0 | | 80 | 0 | 0 |
| Requirements Defect | System Testing | | 24 | 0 | | 48 | 0 | | 96 | 0 | 0 |
| Requirements Defect | User Acceptance Testing | | 32 | 0 | | 64 | 0 | | 128 | 0 | 0 |
| Requirements Defect | Implementation & Post Implementation | | 40 | 0 | | 80 | 0 | | 160 | 0 | 0 |
| Design Defect | Design Review | | 4 | 0 | | 8 | 0 | | 16 | 0 | 0 |
| Design Defect | Code Review & Unit Testing | | 8 | 0 | | 16 | 0 | | 32 | 0 | 0 |
| Design Defect | System Testing | | 20 | 0 | | 40 | 0 | | 80 | 0 | 0 |
| Design Defect | User Acceptance Testing | | 30 | 0 | | 60 | 0 | | 120 | 0 | 0 |
| Design Defect | Implementation & Post Implementation | | 40 | 0 | | 80 | 0 | | 160 | 0 | 0 |
| Coding Defect | Code Review & Unit Testing | | 4 | 0 | | 8 | 0 | | 16 | 0 | 0 |
| Coding Defect | System Testing | | 10 | 0 | | 20 | 0 | | 40 | 0 | 0 |
| Coding Defect | User Acceptance Testing | | 20 | 0 | | 40 | 0 | | 80 | 0 | 0 |
| Coding Defect | Implementation & Post Implementation | | 30 | 0 | | 60 | 0 | | 120 | 0 | 0 |
| Implementation | Implementation & Post Implementation | | 20 | 0 | | 40 | 0 | | 80 | 0 | 0 |
| CHANGE IN OVERALL PROJECT EFFORT | | | | | | | | | | | 48 |
| Offshore Cost Impact | | | | | | | | | | | \$ 1,200 |

Table 5: Requirement Defects detected in the implementation /post-implementation stages

| Defect | Phase Detected | Min Defects | Effort / FP | Change in Effort | Mod Defects | Effort / FP | Change in Effort | Maj Defects | Effort / FP | Change in Effort | Change in Effort |
|---|--------------------------------------|-------------|-------------|------------------|-------------|-------------|------------------|-------------|-------------|------------------|------------------|
| Requirements Defect | Requirements | | 4 | 0 | | 8 | 0 | | 16 | 0 | 0 |
| Requirements Defect | Design Review | | 10 | 0 | | 20 | 0 | | 40 | 0 | 0 |
| Requirements Defect | Code Review & Unit Testing | | 20 | 0 | | 40 | 0 | | 80 | 0 | 0 |
| Requirements Defect | System Testing | | 24 | 0 | | 48 | 0 | | 96 | 0 | 0 |
| Requirements Defect | User Acceptance Testing | | 32 | 0 | | 64 | 0 | | 128 | 0 | 0 |
| Requirements Defect | Implementation & Post Implementation | 4 | 40 | 160 | 1 | 80 | 80 | 1 | 160 | 160 | 400 |
| Design Defect | Design Review | | 4 | 0 | | 8 | 0 | | 16 | 0 | 0 |
| Design Defect | Code Review & Unit Testing | | 8 | 0 | | 16 | 0 | | 32 | 0 | 0 |
| Design Defect | System Testing | | 20 | 0 | | 40 | 0 | | 80 | 0 | 0 |
| Design Defect | User Acceptance Testing | | 30 | 0 | | 60 | 0 | | 120 | 0 | 0 |
| Design Defect | Implementation & Post Implementation | | 40 | 0 | | 80 | 0 | | 160 | 0 | 0 |
| Coding Defect | Code Review & Unit Testing | | 4 | 0 | | 8 | 0 | | 16 | 0 | 0 |
| Coding Defect | System Testing | | 10 | 0 | | 20 | 0 | | 40 | 0 | 0 |
| Coding Defect | User Acceptance Testing | | 20 | 0 | | 40 | 0 | | 80 | 0 | 0 |
| Coding Defect | Implementation & Post Implementation | | 30 | 0 | | 60 | 0 | | 120 | 0 | 0 |
| Implementation | Implementation & Post Implementation | | 20 | 0 | | 40 | 0 | | 80 | 0 | 0 |
| CHANGE IN OVERALL PROJECT EFFORT | | | | | | | | | | | 400 |
| Offshore Cost Impact | | | | | | | | | | | \$ 10,000 |

With respect to severity, defects are classified as Major, Moderate and Minor. Under this classification, Major severity defects are displayed with high posterior in graphs plotted based on defects, phased detect and phase attributed as shown in the figures 5 to 7.

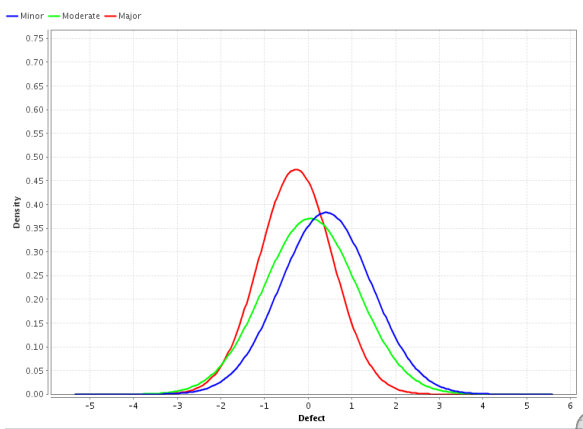


Figure 5: Classifier of defect severity based on the defect

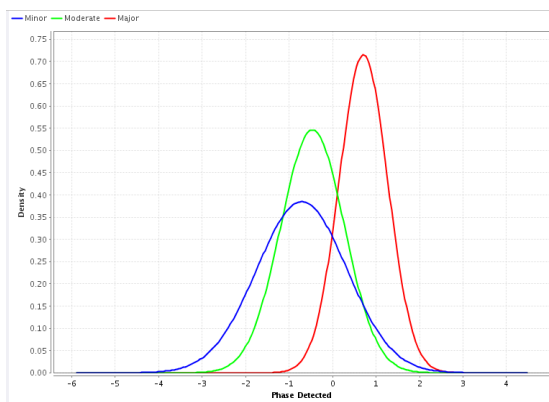


Figure 6: Classifier of defect severity based on phase detected

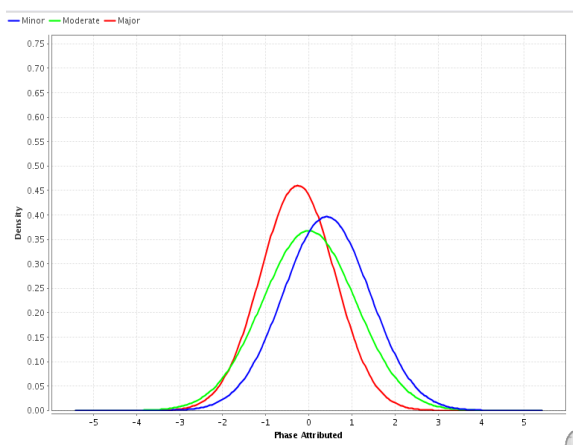


Figure 7: Classifier of defect severity based on phase attributed

Confusion Matrix

| a | b | c | Classified as |
|-----------|-----------|-----------|---------------|
| 28 | 1 | 1 | a = Minor |
| 0 | 29 | 2 | b = Moderate |
| 0 | 3 | 49 | c = Major |

From the confusion matrix, 106 instances of data can be classified out of 115 instances. 92.1739% of data can be classified as accurate. 28 instances of defects are minor, 29 instances of defects are moderate and 49 instances of defects are major.

CONCLUSION

In this research, it can be concluded that the impact of defects detected at earlier stages of software development life cycle has less effort, schedule and cost impact at the later stages. With respect to severity, defects can be classified as major, moderate and minor based on the set of predefined attributes. Under the Naïve Bayes classification, major severity defects display high posterior.

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