# 國立交通大學

## 資訊科學與工程研究所

## 碩士論文

應用動態樁技術於合作式網頁應用程式測試

Applying Dynamic Stubbing Technique to Support Collaborative Testing of Web Application

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## 國立交通大學 資訊科學與工程研究所 碩士論文

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#### 摘要

現今,在網際網路上大量的免費人力資源通常被運用來減少測試成本與驗證軟體, 如:線上遊戲與開放原始碼軟體。然而,傳統的合作測試方法在不考慮大眾測試者有共 同的測試偏好與測試者素質參差不齊的情況下,往往會有測試時間難以收斂與測試報告 的可信度不高等議題。為了加速收斂網站測試,有必要應用細顆粒的網頁應用程式模型 來平行化測試工作。在這篇研究中,首先我們提出狀態轉換圖來為使用者的執行行為建 模以達到分解網頁應用程式測試問題的目的。更進一步為了達到加速測試速度與改善測 試報告的品質,並且減少合作測試的總成本,我們提出了一個動態樁技術來引導使用者 進行測試。動態樁技術結合所提出的細顆粒的網頁應用程式模型可以在大眾測試者沒有 察覺的情況下改變測試環境來導引他們解決子問題。實驗結果顯示我們所提出的方法可 以減少 50% 的測試成本與增加 30% 的偵測效能。

**關鍵字**:大眾化分類、合作式測試、網頁應用程式測試、狀態轉換圖、程式相依圖、動 態樁技術

## Applying Dynamic Stubbing Technique to Support Collaborative Testing of Web Application

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#### Abstract

Nowadays, large volunteers creeping on internet are usually treated as free human resources for reducing test cost and validating software, like online games and open source software. However, traditional collaborative testing design and management approach encounters the long due time and doubting test report resulting from the common preferences of users and unqualified testers, respectively. A fine-grained Web application model is essential to refine job assignments for speeding up test coverage. In this thesis, we first propose State Transition Diagram to model the users' runtime behaviors for decomposing Web application testing problem. Then, based on this fine-grained Web application model, a dynamic stubbing technique which allows folk testers contribute themselves in solving sub-problems with barely noticing the change of test environment is proposed for achieving faster test coverage speed and improving the quality of test report, and hence reduces the total cost of collaborative testing. The experimental results show that our proposed approach can reduce 50% test cost and increase 30% detection performance.

**Keywords:** folksonomy-based approach, collaborative testing, Web application testing, state transition diagram, program dependence graph, dynamic stubbing technique.

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## **Chapter 1 Introduction**

Collaborative testing is widely used in industries to reduce test cost and assure the software quality, especially in online game, open source software and Web applications. Low reliability of Web application will lead to serious detrimental effects for businesses, consumers, and the government because users increasingly depend on the Internet for routine daily operations. However, lacking of good test design and management approach, unqualified folk testers with some common preferences will slow down the test convergence and produce suspect test report. Due to the untrammeled nature of folks, restricted test scenario according to different test design and management approach may decrease their willingness and hence reduce available human resources. It procures more cost of collaborative testing. A good test design and management approach should take the willingness and common preferences of folk testers into consideration.

Problem decomposition which reduces original collaborative testing problem into several sub-problems is an efficient and effective approach for speeding up collaborative test and increasing the quality of test report. The reduced sub-problems are easier and can be assigned in parallel for decreasing the due time. Besides, the solution of sub-problems can be easily merged to the one of original problem, and hence can complete test. In the meanwhile, testers concentrating on small problem can detect faults more easily, and hence improving the quality of test report.

The success of problem decomposition relies on a proper Web application model. However, traditional Web application models, like page navigation diagram [1]-[9] and finite state machine (FSM) [10]-[20] and Petri-net [21]-[25], do not take software fault into consideration and hence suffer the risk of causing Type I and II error. A software fault classification based on program dependence graph has been proposed [26]. Tung et al. propose a novel test case generation algorithm based on this fault classification to generate a test suite with full fault-detection [27]. Huang further extended Tung's model to three-level program dependence graph (page level, function level and code level) for considering the perspectives from folk testers (Web pages) and test objective from developer (basic blocks coverage) [28]. However, the three-level program dependence graph is a coarse-grained model because it does not model input values. Hence it cannot be applied to further problem decomposition according to runtime behavior of users.

In this thesis, we refine coarse-grained three-level dependence graph to fine-grained value-oriented dependence graph (VDG) which models users' runtime behavior by considering runtime input value. Figure 1 shows flow chart of program containing basic blocks 1, 2, and 3 where each basic block means they are a maximal code fragments without branching of a function [29]. If value of variable a is more than 0 then basic block 1 and basic block 2 can be covered. Otherwise, basic block 1 and basic block 3 can be covered. So, different values of variable may have different behaviors of program. By considering input value, the testing problem can be further decomposed into two sub-problems which are still able to meet the test criteria, basic blocks coverage. For the purpose of fine turning collaborative test plan, we further propose State Transition Diagram (STD) based on VDG in Chapter 3. Each state of STD represents a program behavior of a page. Based on this state transition diagram, we can assign job more precisely in collaborative testing and guide testers to meet the test objective, basic blocks coverage.

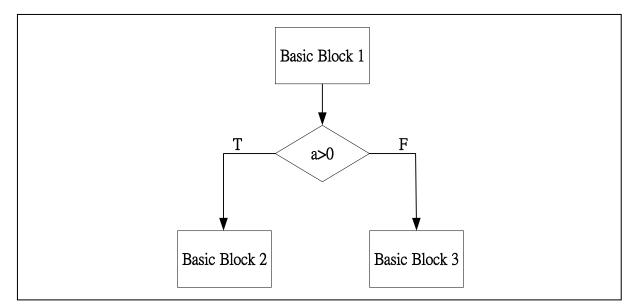


Figure 1. Flow chart of program

The Minimum Testing Cost Problem in collaborative testing (MTCP) can be considered as a variant of Job Assignment Problem (or Optimum Representative Set Problem) [30] with further constraints on testing resources and tester trustworthy. We reduce Job Assignment Problem to MTCP and prove that MTCP is NP-complete in Chapter 4. Therefore, a heuristic-based dynamic stubbing algorithm for job assignment is proposed to solve this problem by overcoming the issue of centralized preferences and willingness of folk testers which can speed up the test coverage and hence reduce the test cost.

We implement prototype system with our proposed approach by the dynamic stubbing technique which allows folk testers contributing their human resources with barely noticing varying test environment. Our collaborative testing system can collect tester user sessions during testing processes. To support collaborative testing, we record the testing logs and guide the test activities on our collaborative testing system. These testing logs are analyzed by proposed report analysis algorithm to form high quality test report. The experimental results show that our approach which reduces 50% due time and increases 30% detection rate is both efficient and effective.

We briefly outline the contents of this thesis. Chapter 2 provides related works. Chapter 3 gives the Web application modeling and the corresponding value-oriented dependence graph construction algorithm and state transition diagram construction algorithm. We also present the dynamic stubbing technique to support the Minimum Collaborative Testing Problem with the proposed heuristic-based dynamic stubbing algorithm in Chapter 4. Chapter 5 explains how the experimental design and experimental result. We conclude this thesis in Chapter 6.



## **Chapter 2 Related Works**

In the chapter, we will discuss several different models of the web applications testing, and each model has different test goals. We briefly describe two types of the models, including structure of software systems only considering structure of systems and behavior of software systems considering both structure and behavior of systems.

#### **2.1 Structure of software systems**

There are some models which describe structure of program as follows. A program dependence graph [31]-[37] is a directed graph in which the nodes are statements and predicate expressions and the edges are dependences between the nodes. Two types of dependences are data dependence and control dependence between nodes. The data dependence between two statements means that the input variable of a statement is transferred from the other statement. The control dependence means that the flow of statements is decided by certain predicate expressions. The UML class diagrams [38] describing structures of software systems are also a directed graph in which nodes are classes of an object-oriented system and edges are dependences and inheritances between classes.

These structure-based models are unable to describe behaviors of folk testers and hence not suitable for collaborative testing.

#### 2.2 Behavior of software systems

Another kind of software models, including page navigation diagram and finite state machines, aim to describe behavior of program. The page navigation diagram [1]-[9] is a directed graph where nodes are Web pages and edges are links between Web pages. The model can describe all test paths for Web applications testing. Huaikou et al. [1] proposed an approach which uses a regular expression characterizing the directed graph on page navigation diagram to generate test paths. Benedikt et al. [2] presented VeriWeb, which is a

tool for automatically navigating links of Web applications and exploring execution test paths through dynamic components of Web applications with a search algorithm. Shengbo et al. [4] and Zhongsheng et al. [7] proposed an algorithm to generate Test-Trees from page navigation diagram for satisfying link and page coverage.

The Final State Machine (FSM) [10]-[20] is used to model Web applications and it is a directed graph including nodes and edges. There are two types of the nodes: Web pages and associated components. There are three types of the edges: link edge, call edge and build edge. The link edge means that Web page can link the other Web page or component. The call edge means that Web page can call component through delivering requests to it. The build edge means that the component can build the new web page as responses to the requests. Andrews et al. used FSM to model and test Web applications, and then proposed an approach which decomposes Web application into several subsystems based on FSM with constraints to generate test sequences [10]. Liping et al. proposed the Kripke structure that is a model of FSM to model Web applications from the user's viewpoint [15]. The model can generate test sequences satisfying state and transition coverage for Web applications. However, page navigation diagram and finite state machines did not consider fault-detection ability and were risk of suffering Type I and II error. Furthermore, these models are coarse-grained because of the lack of input domain information. Three-level dependence graph which is also a model of behavior of software system is presented in next section.

#### 2.3 Three-level dependence graph

Huang [28] considered the perspectives from folk testers (Web pages), test objective from developer (basic blocks coverage) and fault-detection ability to propose three-level dependence graph (page-level, function-level and code-level), illustrated in Figure 2. In page-level, the nodes are Web pages and the edges are links between Web pages. In function-level, the nodes are functional statements and the edges are constructed by functional statements. And in code-level, the nodes are basic blocks that are a maximal code fragments without branching of a function and the edges are control flow between the basic blocks. Dependence edge and independence edge are intra-level edges where dependence edge can transfer data between Web pages, functions, and basic blocks. And the other edge is containing edge which can connect different nodes between page-level, function-level, and code-level. However, this three-level dependence graph cannot model the users' runtime behavior, and is hence coarse-grained and improper for fine job assignment in collaborative testing.

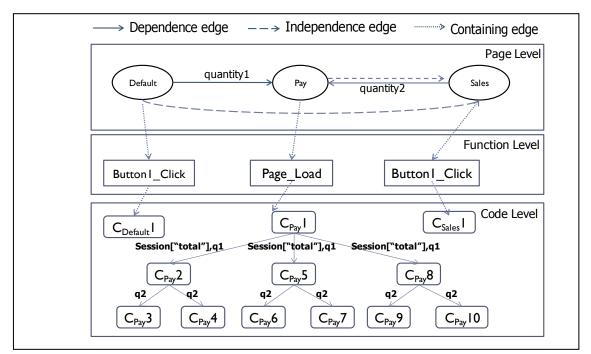


Figure 2. Three-level dependence graph

### **Chapter 3 Web application testing model**

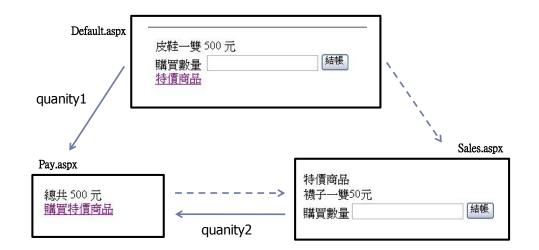
In the chapter, we will propose a novel model to support the collaborative testing for Web application. First, we start with a motivation example and then propose a fine-grained value-oriented dependence graph which models user's input domain information based on three-level dependence graph [28]. Finally, we propose state transition diagram which is a novel runtime behavior model for decomposing original collaborative testing problem into several sub-problems.

#### 3.1 Motivation

One of the most importance objectives in software testing is to assure the software quality by covering all the code statements. However, covered code statements in each execution depend on input values. The Example 1 is given to motivate us that a fine job assignment needs to take variable value into consideration.

#### **Example 1:**

The shopping Web-site contains Default.aspx, Pay.aspx, and Sales.aspx pages. Consumers decide the amount of shoes (quantity1) and socks (quantity2) they want to buy in Default.aspx and Sales.aspx, and then this purchase information will be transferred to Pay.aspx for following payment. Figure 3a shows source code of Pay.aspx page. Figure 3b shows the flow chart for the source code of Pay.aspx page, and these basic blocks can be covered depend on consumer's input different values from Default.aspx page. If consumers key in quantity1 value which is less than or equal to 0, then  $C_{Pay}1$  and  $C_{Pay}2$  will be covered in this execution. Otherwise,  $C_{Pay}1$  and  $C_{Pay}3$  will be covered.



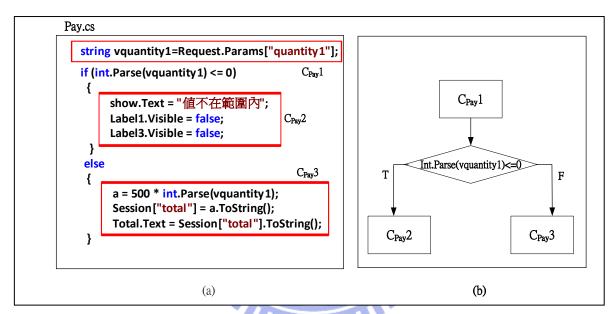


Figure 3. Source code of Pay.aspx page (a) with its flow chart (b) in Example 1

#### **3.2 Value- oriented dependence graph**

Based on the above motivated example, the three-level dependence graph shown in section 2.3 cannot describe different executions in different values because it cannot model users' input values. We first define the tainted variables in branch predicate which can be controlled by user and decide the flow of executions, and then we refined three-level dependence graph to value-oriented dependence graph. The definition and construction algorithm of value-oriented dependence graph are also presented in this section. Finally, an example is provided to illustrate value-oriented dependence graph construction algorithm.

#### 3.2.1 Tainted variables in branch predicate

Figure 3 motivates us that a fine job assignment requires the value information of variables. However, only some variables will depend on user's input to influence the program execution flow. Therefore, we first consider the variable which can decide the flow of a program. This kind of variables dominating the execution flow is defined as branch predicate variables. In collaborative testing, testers can only use input variable and hyperlink to validate Web site. Hence, we define input variable and tainted variable which are controllable variable of testers. Finally, the tainted variables in branch predicate in a fine collaborative testing are defined if it is branch predicate variables and tainted variable. The formal definitions and notations of branch predicate variables, input variable, tainted variable and tainted variables in branch predicate are provided below:

### Definition 1 (Branch predicate variables V<sub>BP</sub><sup>i</sup>)

A variable  $V_{BP}^{i}$  is the  $i_{th}$  branch predicate variable if it is related to program behavior of a page. It affects code flow chart of the page. 1896

#### Definition 2 (Input variable V<sub>IN</sub><sup>i</sup>)

A variable  $V_{IN}^{i}$  is the  $i_{th}$  input variable if it is a frame of each page which user can input value.

## **Definition 3 (Tainted variable V<sub>T</sub><sup>i</sup>)**

A variable  $V_T^{i}$  is the  $i_{th}$  tainted variable if there is related to the input variable  $V_I^{i}$  of the page.

#### Definition 4 (Tainted variable in branch predicate V<sub>TBP</sub><sup>i</sup>)

A variable  $V_{TBP}^{i}$  is the  $i_{th}$  tainted variable in branch predicate if it is branch predicate variable and tainted variable which means it affects program behavior of the page.

Example 1 of the above variables is shown in Figure 4, where quantity1 is the only input variable and the tainted variable of quantity1 consists quantity1, vquantity1, a, Session["total"]

and Total.Text. vquantity1 is the only variable which will influence the flow of Pay.aspx and hence is branch predicate variable. Therefore, in this simple example, vquantity1 is both branch predicate variable and an element of tainted variable, and hence is the tainted variable in branch predicate in collaborative testing on this shopping website.

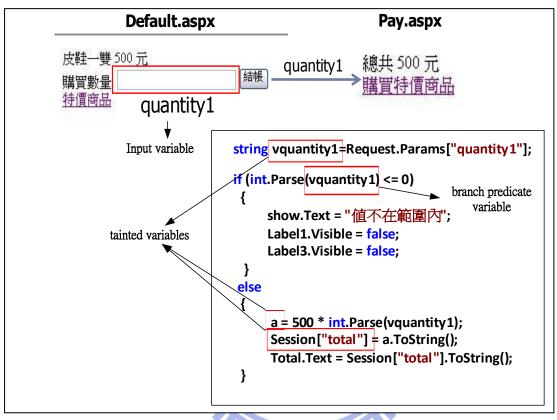


Figure 4. Differents of three variables in Example 1

#### **3.2.2 Definition of Value- oriented dependence graph**

Three-level dependence graph [28] is proposed to connect the perspectives from folk testers (Web pages), test objective from developer (basic blocks coverage). However, the lack of variable value information of three-level dependence graph cannot lead to fine collaborative testing. We further extend three-level dependence graph to value-oriented dependence graph by considering variable value information. There are three types of the vertexes (a set of pages, a set of functions, and a set of basic blocks) in the value-oriented dependence graph. And there are five types of the edges in the value-oriented dependence graph. Three of them are intra-level edges representing the connections within page-level, function-level, and code-level. The other two are inter-level edges representing the connections between different levels. The formal definition of value-oriented dependence graph is provided below:

#### **Definition 5: Value-oriented dependence graph**

Value-oriented Dependence graph G= (V, E)  $V_{IN}^{i}$  is an input variable  $I = \{V_{IN}^{i} | V_{IN}^{i} \text{ is an input variable}\}$  is the set of input variables  $R = \prod_{i=1}^{n} R(V_{IN}^{i}) = R(V_{IN}^{-1}) \times R(V_{IN}^{-2}) \times ... \times R(V_{IN}^{n})$ , where  $R(V_{IN}^{i})$  is an image of variable  $V_{IN}^{i}$   $V = V_P \cup V_F \cup V_C$ , where  $V_P = \{PA_i | PA_i \text{ is a page}\}$  is the set of the pages  $V_F = \{F_i | F_i \text{ is a function}\}$  is the set of the functions  $V_C = \{C_i | C_i \text{ is a basic block}\}$  is the set of the basic blocks  $E = E_P \cup E_F \cup E_C \cup E_{PF} \cup E_{FC}$ , where  $E_P = \{(PA_i, PA_j, I_{ij}, R_{ij})|PA_i, PA_j \in V_p, I_{ij} \in I, R_{ij} \in R\}$   $E_F = \{(F_i, F_j, I_{ij}, R_{ij})|F_i, F_j \in V_F, I_{ij} \in I, R_{ij} \in R\}$   $E_F = \{(C_i, C_j, I_{ij}, R_{ij})|C_i, C_j \in V_c, I_{ij} \in I, R_{ij} \in R\}$  $E_{PF} = \{(P_i, F_j)|P_i \in V_P, F_j \in V_F\}$ 

Figure 5 shows value-oriented dependence graph in Example 1. Compared to three-level dependence graph, we further record tainted variable in branch predicate value information in edges. Different tainted variable in branch predicate values decide the permission of distinct edge and hence decide which basic blocks will be covered in different execution. The details of value-oriented dependence graph construction algorithm will be presented in the next section.

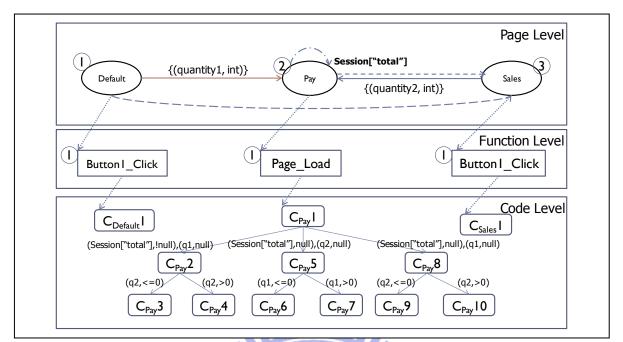


Figure 5. Value-oriented dependence graph in Example 1

## 3.2.3 Value-oriented Dependence Graph (VDG) construction algorithm

First, we will detect nodes of page-level, function-level, and code-level based on different pattern sets of each level, and then construct edges of each node in page-level, function-level, and code-level with the subroutine "EdgeConstruction" based on the pattern sets of each level. Finally, we construct the variables of each type with the subroutine "VariablesSetConstruction" based on the pattern sets of each type.

#### Value-oriented dependence graph construction algorithm

```
Input:
   Folder which stores file of each page
  Page code segments B_a = \{B_a^1, \dots, B_a^n\}, B_c = \{B_c^1, \dots, B_c^n\}
  Pattern set of declare page P<sub>P</sub>
   Pattern set of declare function P<sub>F</sub>
  Pattern set of declare code P<sub>C</sub>
   Pattern set of declare input variables P<sub>I</sub>
   Pattern set of declare global variables P<sub>G</sub>
   Pattern set of declare branch predicate variables P_{BP}
   T_P, where T_P = P_P \cup P_F \cup P_C
Output: Value-oriented Dependence graph , G=(V,E) , where V=V_P \cup V_F \cup V_C ,
E = E_P \cup E_F \cup E_C \cup E_{PF} \cup E_{FC}
Method:
   Initial: V=Ø,E=Ø
   Step1: For each line L in folder
              If L contains pattern P_P then add the node into VP
  Step2: For each B_c^{i} in B_c
         2.1: For each line L in B_c^{i}
                If L contains pattern P_F then add the node into V_F
         2.2: Add edge from the page node to the function node
  Step3: For each B_c^{i} in B_c
         3.1: For each line in B_c^{i}
                If L contains pattern P_C then add the node into V_C
         3.2: Add edge from the function node to the basic block code
   Step4:
       4.1: For each B_a^{i} in B_a
              EdgeConstruction(B_a^{i}, P_P)
       4.2: For each B_c^{i} in B_c
              EdgeConstruction(B_c^{i}, P_P)
   Step5: For each B_F^{i} in V_F
              EdgeConstruction(B_c^{i}, P_F)
  Step6: For each B in VC
              EdgeConstruction(B_c^{i}, P_C)
  Step7: For each B_a^{i} in B_a
            I(V_i) = VariablesSetConstruction (B_a^i, P_I)
   Step8: For each B_c^{i} in B_c
```

G (V<sub>i</sub>) = VariablesSetConstruction (B<sub>c</sub><sup>i</sup>,P<sub>G</sub>) Step9: For each B<sub>c</sub><sup>i</sup> in B<sub>c</sub> T (V<sub>i</sub>) = VariablesSetConstruction (B<sub>c</sub><sup>i</sup>,I(V<sub>i</sub>)) Step10: For each B<sub>c</sub><sup>i</sup> in B<sub>c</sub> BP (P<sub>i</sub>) = VariablesSetConstruction (B<sub>c</sub><sup>i</sup>,P<sub>BP</sub>) Step11: TBP (P<sub>i</sub>)= ( $\bigcup_{i=1}^{n} BP(P_i)$ ) $\cap$ ( $\bigcup_{j=1}^{m} T(V_j)$ )

#### Subroutine: EdgeConstruction

Input: Code segment  $B \land T_P$ Output: Dependence graph of each level

Method:

Step1: For each line L in B

If L contains pattern T<sub>P</sub> then construct edge of nodes

Step2: Return Dependence graph of each level

#### Subroutine: VariablesSetConstruction

Input: Code segment  $B \\ T_P$ Output: Set of variable S Method: Step1: For each line L in B If L contains pattern  $T_P$  then add the variable into S Step2: Return S

#### **3.2.4 Example of Value-oriented dependence graph**

At server side, there are various techniques to develop dynamic web page such as ASP.NET with C#, JSP, and PHP. At client side, HTML and JavaScript are used widely to support the development of the web applications. Hence, we only consider the ASP.NET with C# language, and the other language such as HTML, JavaScript can be considered by simple extension. In Table 1, according to different levels with page, function, and code we classify patterns of the nodes and the edges in the value-oriented dependence graph. In Table 2,

according to different variables with input, global, and branch predicate we classify patterns of these variables in the value-oriented dependence graph.

Level	Pattern	
Page Node	.aspx	
Page Edge	Response.Redirect	
Page Edge	NavigateUrl	
Function Node	(protected  private	
	public)?[](void bool int float)	
Function Edge	Function caller	
Code Node	(if else for while switch)	
Code Edge	Flow chart	

 Table 1. Property of Patterns of Different level

Level	Pattern	
Input Variable	<asp:textbox id='/"(a-zA-Z0-9)+/"&lt;/td'></asp:textbox>	
Input Variable	<asp:dropdownlist "<="" id='/"(a-zA-Z0-9)+' td=""></asp:dropdownlist>	
Input Variable	<asp:listbox "<="" id='/"(a-zA-Z0-9)+' td=""></asp:listbox>	
Input Variable	<asp:checkbox "<="" id='/"(a-zA-Z0-9)+' td=""></asp:checkbox>	
Input Variable	<asp:checkboxlist "<="" id='/"(a-zA-Z0-9)+' td=""></asp:checkboxlist>	
Input Variable	<asp:radiobutton "<="" id='/"(a-zA-Z0-9)+' td=""></asp:radiobutton>	
Input Variable	<asp:radiobuttonlist id='/"(a-zA-Z0-9)+&lt;/td'></asp:radiobuttonlist>	
/"		
Global Variable	Session[/ "(a-zA-Z0-9)+ /"]=	
Global Variable	<b>S</b> =Session[/ "(a-zA-Z0-9)+ /"]	
Branch predicate variable	if((a-zA-Z0-9_>=<& ())+)	
Branch predicate variable	while((a-zA-Z0-9_>=<& ())+)	
Branch predicate variable	for((a-zA-Z0-9_>=<& ())+)	
Branch predicate variable	do	
~~~	while((a-zA-Z0-9_>=<& ())+)	
Branch predicate variable	Switch	
	case 1: (a-zA-Z0-9_>=<& ())+	
	case 2: (a-zA-Z0-9_>=<& ())+	
	case i: (a-zA-Z0-9_>=<& ())+	

Table 2. Property of Patterns of Different variable

The Example 2 is given to illustrate the value-oriented dependence graph construction algorithm, where Figures 6-1 to 6-11 show the results after executing steps 1 to 11, respectively.

Example 2:

The Example 2 continues Example 1. According to the source code of each page, "Property of Patterns of Different level" in Table 1, and "Property of Patterns of Different variable" in Table 2, we can construct the value-oriented dependence graph.

Since the pattern of page node is ".aspx", after executing step 1, we can construct each page to the node in page-level as shown in Figure 6-1.

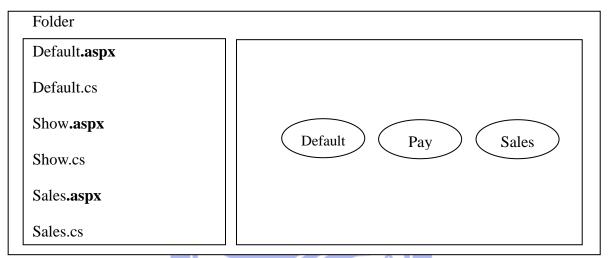


Figure 6-1. Value-oriented dependence graph after executing Step 1 of VDG algorithm

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Since the pattern of function node is "(protected| private | public)?[](void|bool|int|float)" in Table 1, after executing step 2, we can construct each function for the given page to the node in function-level and connect the given page and the function with corresponding edge as shown in Figure 6-2.

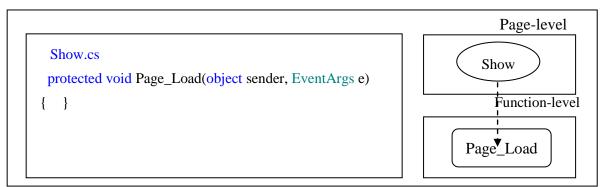


Figure 6-2. Value-oriented dependence graph after executing Step 2 of VDG algorithm

Since the pattern of code node is "(if|else|for|while|switch)" in Table 1, after executing step 3, we can construct each basic block for the given function to the node in code-level, and connect the function and the basic block with corresponding edge as shown in Figure 6-3.

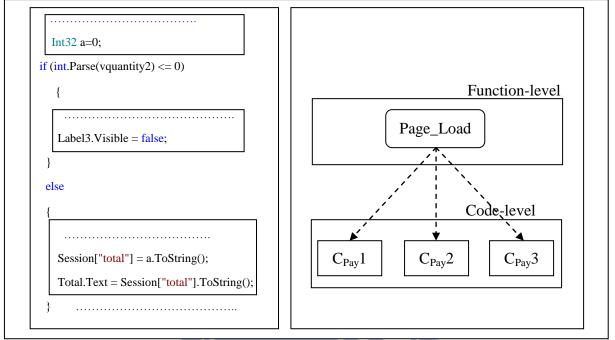


Figure 6-3. Value-oriented dependence graph after executing Step 3 of VDG algorithm

Since the pattern of page edge is "Response.Redirect" and "NavigateUrl" in Table 1, after executing step 4, we can connect nodes in page-level with corresponding edges as shown in Figure 6-4.

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Figure 6-4. Value-oriented dependence graph after executing Step 4 of VDG algorithm

Since the pattern of function edge in Table 1, after executing step 5, we can connect nodes in function-level with corresponding edges as shown in Figure 6-5.

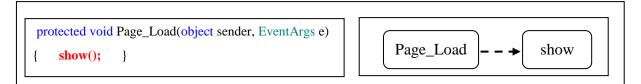


Figure 6-5. Value-oriented dependence graph after executing Step 5 of VDG algorithm

Since the pattern of code edge in Table 1, after executing step 6, we can connect nodes in code-level with corresponding edges as shown in Figure 6-6.

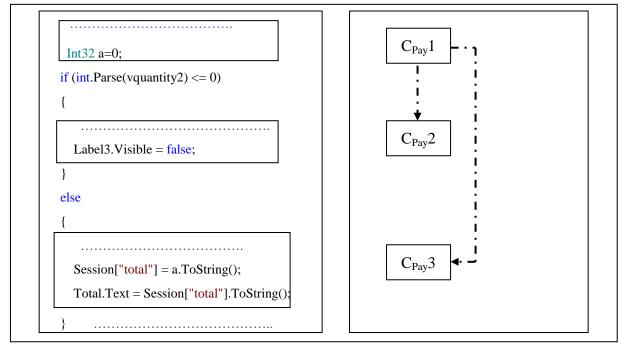


Figure 6-6. Value-oriented dependence graph after executing Step 6 of VDG algorithm

Since the pattern of input variable in Table 2, after executing step 7, we can construct input variables of each page as shown in Figure 6-7.

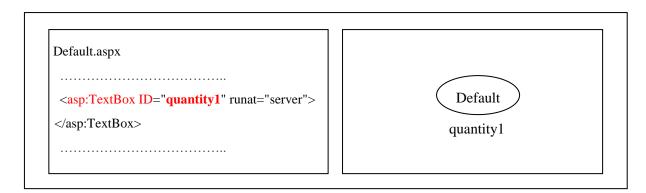


Figure 6-7. Value-oriented dependence graph after executing Step 7 of VDG algorithm

Since the pattern of global variable in Table 2, after executing step 8, we can construct global variables of each page as shown in Figure 6-8.

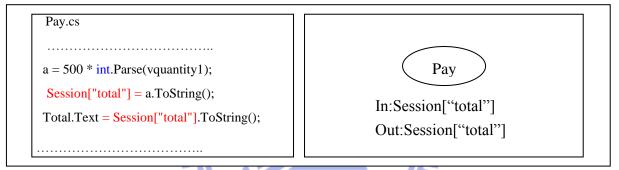


Figure 6-8. Value-oriented dependence graph after executing Step 8 of VDG algorithm

Since the pattern of input variable, after executing step 9, we can construct tainted variables of each page as shown in Figure 6-9.

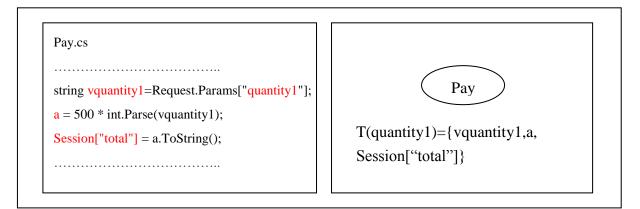
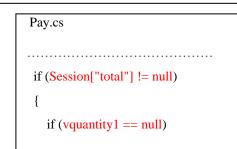


Figure 6-9. Value-oriented dependence graph after executing Step 9 of VDG algorithm

Since the pattern of branch predicate variables in Table 2, after executing step 10, we can construct branch predicate variables of each page as shown in Figure 6-10.



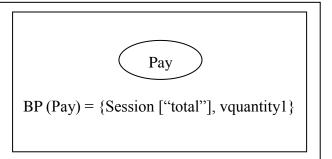


Figure 6-10. Value-oriented dependence graph after executing Step 10 of VDG algorithm

Since the branch predicate variables and tainted variable, after executing step 11, we can construct tainted variables in branch predicate of each page as shown in Figure 6-11.

TBP (P<sub>i</sub>)= 
$$(\bigcup_{i=1}^{n} BP(pi)) \cap (\bigcup_{j=1}^{m} T(vj))$$

Figure 6-11. Value-oriented dependence graph after executing Step 11 of VDG algorithm

#### **3.3 State Transition Diagram**

In the section, we first introduce problem decomposition idea to improve collaborative testing, and then a novel Web application model, state transition diagram, and the corresponding construction algorithm will be presented in this section. An example of state transition diagram construction algorithm will be also provided in this section.

#### **3.3.1 Problem decomposition**

Value-oriented dependence graph provides an opportunity to refine collaborative testing. For further improving collaborative testing, we decompose the Web application testing problem into several sub-problems as shown in Figure 7. Each sub-problem which is easier than original problem because of the smaller size of sub-problem can be independently solved. Afterwards, we can parallelly assign these sub-problems to different folk testers. This parallel property can speed up the whole collaborative testing. However, this parallel assignment requires a proper label design to integrate different test results for following job assignments and final test report. And then, we can easily merge these sub-problems by tracing back according to the labels of all sub-problems.

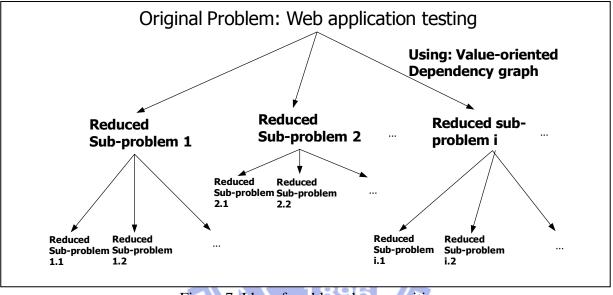


Figure 7. Idea of problem decomposition

#### **3.3.2 Definition of State Transition Diagram**

According to the idea of problem decomposition, we propose a novel Web application model, state transition diagram, which is a fine-grained tree structure model. And it also overcomes the cyclic problem in Web application testing under basic blocks coverage criteria. The state transition diagram models users' runtime behaviors according to different basic blocks coverage. Each state including two parts represents a behavior of the page. The first part is the page number, and the second part is the set of the tainted variables in branch predicate and its values which lead to different behaviors of program. The formal definition of state transition diagram is provided below: State transition diagram  $V_{TBP}{}^{i} \text{ is a tainted variable in branch predicate}$   $D=(S, \delta, S_{0}), \text{ where}$   $S = \{S_{i} | S_{i} \text{ is a state}\}, \text{ where}$   $S_{i}=(N, C), \text{ where}$   $N \in \{ i | PA_{i} \text{ is a page} \}$   $C \subseteq \{(V_{TBP}{}^{i}, R_{i}) | V_{TBP}{}^{i} \in V, R_{i} \in R, i=1 \sim n\}, \text{ where}$   $V = \{V_{TBP}{}^{i} | V_{TBP}{}^{i} \text{ is a tainted variable in branch predicate} \text{ is a set of tainted variables in}$  branch predicate  $R = \prod_{i=1}{}^{n}R(V_{TBP}{}^{i}) = R(V_{TBP}{}^{1}) \times R(V_{TBP}{}^{2}) \times ... \times R(V_{TBP}{}^{n}), \text{ where } R(V_{TBP}{}^{i}) \text{ is an image of}$   $variable V_{TBP}{}^{i}$   $\delta \text{ is a transition function}$   $\delta(S_{i}, A) = S_{j}, \text{ where}$   $A \subseteq \{(V_{TBP}, R_{i}) | V_{i} \in V, R_{i} \in R, i=1 \sim n\}$   $S_{0} \text{ is an initial state}$ 

Figure 8 shows the state transition diagram in Example 1. Compared to value-oriented dependence graph, the tree structure provides a kind of problem decomposition. Each path from root represents a sub-problem of Web application testing. The details of state transition diagram construction algorithm will be presented in the next section.

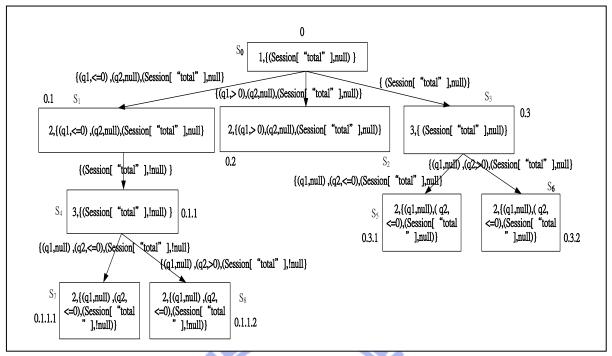


Figure 8. State transition diagram in Example 1

## 3.3.3 State Transition Diagram (STD) construction algorithm

From the purpose of speeding up collaborative testing, we first apply Breadth-First Search (BFS) on the page-level of value-oriented dependence graph to parallelly distribute folk testers. At each new visiting page, we further drill down to code-level of value-oriented dependence graph to identify different states based on distinct program flow. In the meanwhile, the proper label is created for these new states. The details of state transition diagram are presented below:

#### State transition diagram algorithm

## Input: Value-oriented Dependence graph G, C[i]: tainted variable in branch predicate C of each page PA<sub>i</sub>, S<sub>0</sub>:initial state which Label 0, N[i]:start basic block of each page PA<sub>i</sub> color(i,c): node c is in code level of page PA<sub>i</sub> Output: State transition diagram STD D=(S, $\delta$ , S<sub>0</sub>) Method: Initial: S=Ø, $\delta$ =Ø, j=1, k=1 Step1: for each page number P which from small to large $\in$ adj [S<sub>0</sub>.N] in G ConstructionNextState (S, P) Step2: For each new state s' in S 2.1: k=1 2.2: for each page number P which from small to large $\in$ adj[s'.N] in G ConstructionNextState (s', P) Step3: Repeat Step2 until there is no new state.

```
Subroutine: ConstructionNextState
```

Input:		
S: State		
P: Page number		
Output: null		
Step1: IF S <sub>0</sub> modify global value	update global variable value of C[i]	
ELSE	update global variable value with $S_0$ of $C[p]$	
Step2: add the variable of edge into C[p]		
Step3: for each node c		
Color (p,c)=white		
Step4: StateCreation (S <sub>0</sub> ,p, C[p],N[p],0)		
Step5: Change back global variable value of C[p]		

## Subroutine: IsANewState

# $\label{eq:spectral_state} Input: $$$$ Spectrum Spectrum$

Subroutine: StateCreation

Input:

Sp:Previous state
p: page number
C[p]: tainted variable in branch predicate of p
c<sub>0</sub>: start basic block of each page
i: Previous label
Output: null
Method:
Step1: IF number of out-degree of c<sub>0</sub> is zero or Color is black
1.1: color (p, c<sub>0</sub>)=black
1.2: Add p into first part of S'
1.3: Add coming edge condition into second part of S'
1.4: IsANewState(S<sub>P</sub>,S',i)
Step2: for each basic block c' in neighborhood of c<sub>0</sub>
IF condition of coming edge of c' accords with C[p]
2.1: add condition of coming edge of c' into second part of S'

2.2: color (p,  $c_0$ )=black

2.3: StateCreation (S<sub>P</sub>,p, C[p],c',i)

## **3.3.4 Example of Constructing State Transition Diagram**

The Example 3 is given to illustrate the state transition diagram construction algorithm, where Figures 9-1 to 9-2 show the result after executing steps 1 to 2, respectively.

#### Example 3:

The Example 3 continues Example 2. According to the value-oriented dependence graph, tainted variables in branch predicate of each page, and initial state, we can construct the state transition diagram.

Since the first part of initial state, we find outgoing edge in page-level of VDG, and then according to tainted variable in branch predicate of the page we search code-level of VDG, after executing step 1, we can construct the new state of initial state. Second, if the state doesn't exist then label and add to state transition diagram as shown in Figure 9-1.

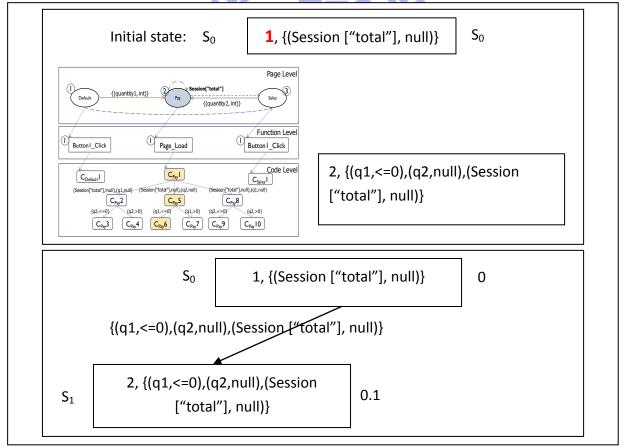


Figure 9-1. State transition diagram after executing Step 1 of STD algorithm

Since the first part of the given new state we find outgoing edge in page-level of VDG, and then according to tainted variable in branch predicate of the page we search code-level of VDG, after executing step 2, we can construct new state of the given new state. Second, if the state doesn't exist then label and add to state transition diagram as shown in Figure 9-2.

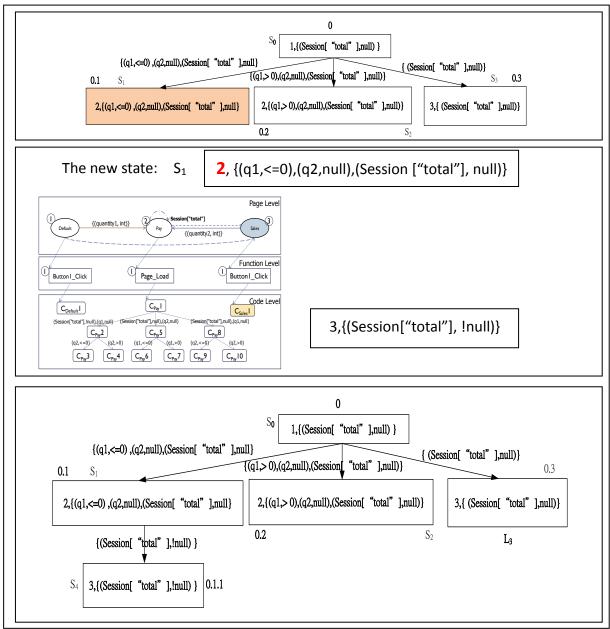


Figure 9-2. State transition diagram after executing Step 2 of STD algorithm

Repeat step 2 until has no new states and state transition diagram as shown in Figure 9-1.

# Chapter 4 Dynamic stubbing technique for collaborative testing

In the chapter, we first provide an example to illustrate that different assignment leads to distinct test cost in collaborative testing. The formal problem formulation of Minimum Test Cost Problem (MTCP) in collaborative testing is presented in this chapter. We also prove MTCP is NP-complete and hence propose a heuristic-based dynamic stubbing algorithm to solve this optimization problem.

## 4.1 Motivating example

Figure 10 shows a simple Web application which contains nine states and eight sub-problems. Assume that each sub-problem needs to be executed once for completing test and three folk testers A, B, and C are involved in this test. The completion time of each sub-problem by different folk tester is listed in Table 3. The due time of collaborative testing is set to be the last folk tester finishing the assigned jobs.

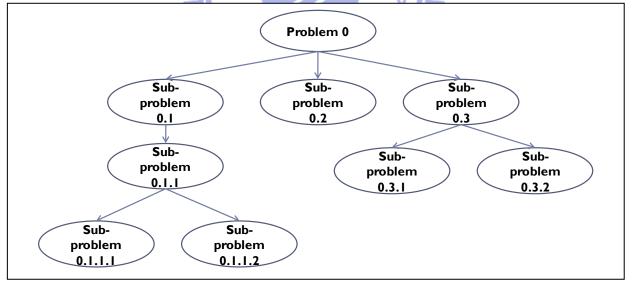


Figure 10. Problem decomposition scenario

	0.1.1.1	0.1.1.2	0.2	0.3.1	0.3.2
Tester A	160 sec	160 sec	80 sec	120 sec	120 sec
Tester B	165 sec	165 sec	85 sec	125 sec	125 sec
Tester C	170 sec	170 sec	90 sec	130 sec	130 sec

Table 3. Sub-problem completion time of each folk tester matrix

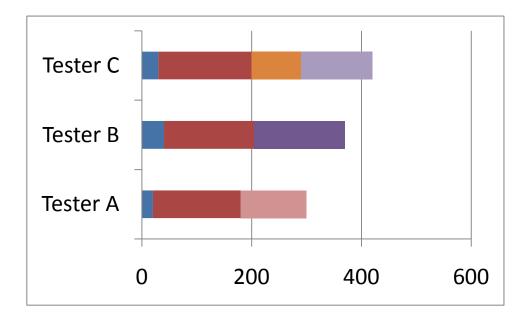
Two different assignments of the example are shown in Table 4 and Table 5. In each table, entry<sub>ij</sub>=1 represents that the  $j_{th}$  job is assigned to  $i_{th}$  tester. Assignment 1 represents that three folk testers have centralized preference on sub-problem 0.1.1.1 and assignment 2 is unbiased on testers' preferences. The due time of these two assignments are 390 sec and 300 sec as shown in Figure 11 and 12. This example illustrates that different assignment leads to distinct test cost (due time) and the centralized preferences of folk testers will delay the whole collaborative testing.

	0.1.1.1	0.1.1.2	896	0.3.1	0.3.2
Tester A	1	0	0	1	0
Tester B	1	1	0	0	0
Tester C	1	0	1	0	1

Table 4. Assignment 1 for shopping Web-site testing

Table 5. Assignment 2 for shopping Web-site testing

	0.1.1.1	0.1.1.2	0.2	0.3.1	0.3.2
Tester A	1	0	0	1	0
Tester B	0	0	0	0	1
Tester C	0	1	1	0	0





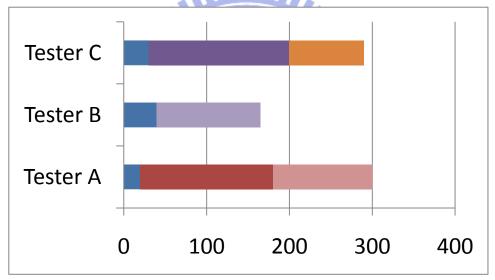


Figure 12. Due time of assignment 2

## 4.2 Minimum Test Cost Problem in Collaborative Testing

Under Internet environment, there are a large number of free and experienced folk human resources. Collaborative testing (or called Beta test) is usually used in online game and open source software to reduce test cost in software development stage. Based on the idea of beta test, we use folk testers in Internet to help us finding and reporting bugs. There are some constraints while applying collaborative testing. First, folk testers may not start to test at the same time and they may delay to start the next test job after finishing current jobs. Second, we only consider those folk testers contributing themselves to collaborative testing. Therefore, each folk tester solves one sub-problem at least. Third, due to different complexity of each sub-problem, each sub-problem has distinct support threshold for completion. And then, the quality of folk testers (trustworthy) is different in Internet; therefore, it needs to consider the accumulation of the testers' trustworthy, rather than the number of testing. Final, each folk tester has different workload.

Before presenting our problem formulation, we first introduce the notations in Table 6. The variables i represents the  $i_{th}$  folk tester, the variable j represents  $j_{th}$  sub-problem, and the variable k represents  $k_{th}$  assignment of the sub-problems. We use the binary variable.  $\sigma_{ijk}$  equals to 1 represents that the  $j_{th}$  sub-problem is assigned to the  $i_{th}$  folk tester in the  $k_{th}$  assignment. Otherwise,  $\sigma_{ijk}$  equals to 0.  $T_{De}(i, j)$  stands for the delay time of the  $i_{th}$  folk tester start to solve the  $j_{th}$  sub-problem,  $T_{Ex}(I, j)$  stands for the  $j_{th}$  sub-problem execution time of the  $i_{th}$  folk tester.  $W_i$  represents the trustworthy of  $i_{th}$  folk tester and  $H_i$  represents the workload of the  $i_{th}$  folk tester.  $ST_j$  represents the support threshold of  $j_{th}$  sub-problem.

## Table 6. Notations of MTCP in collaborative testing

- $i = i_{th}$  folk tester
- $j = j_{th}$  sub-problem
- $k = k_{th}$  assignment of the sub-problems
- $\sigma_{ijk} = i_{th}$  folk tester does the  $j_{th}$  sub-problem in the  $k_{th}$  assignment
- $T_{De}(i, j)$  = the j<sub>th</sub> sub-problem delay time of the i<sub>th</sub> folk tester
- $T_{Ex}(i, j)$ = the  $j_{th}$  sub-problem execution time of the  $i_{th}$  folk tester
- T (i, j)= the  $j_{th}$  sub-problem completion time of  $i_{th}$  folk tester
- $W_i$  = the trustworthy weight of  $i_{th}$  folk tester
- $H_i$ = the available time limit of the  $i_{th}$  folk tester
- ST<sub>j</sub>=support threshold of the j<sub>th</sub> sub-problem

## **4.2.1 Problem formulation**

The Minimum Test Cost Problem (MTCP) in collaborative testing can be formulated as IP-formulation. The objective function is the minimum of due time on different assignment, when due time is the maximum of the sum of sub-problem's time of each folk tester. The constraint 6 is the complete condition that each sub-problem need to be tested at least support threshold. The formulation of MTCP is presented below:

Definition 7: Minimum Test C	Cost Problem (MTCP) definition
Objective function:	
	$\min_{k} \max_{i} \sum_{j} T(i, j) \sigma_{ijk}$
Subject to:	
$1.\sigma_{ijk} \in \{0,1\}$ , $\forall i,j,k$	
2. $T_{De}(i, j) \in \mathbb{R}^+$	
3. $T_{Ex}(i, j) \in \mathbb{R}^+$	
4. T (i, j) $\in \mathbb{R}^+$	
5. $\sum_{j} \sigma_{ijk} \ge 1, \forall k$	
6. $\sum_{i} W_i * \sigma_{ijk} \ge ST_j, \forall k$	
7. $ST_{j} > 0$	
8. $\sum_{j} T(i, j) \sigma_{ijk} \leq H_i, \forall k$	
9. $H_i \in \mathbb{R}^+$	
$10. \sum_{i,j} (\sigma_{ijk} - \sigma_{ijk'})^2 \neq 0, \forall k, k$	$', k \neq k'$
11. $0 < W_i \le 1$	

## **Definition 7: Minimum Test Cost Problem (MTCP) definition**

## 4.2.2 NP-Complete problem

In the section, we introduce an NP-complete problem, Job Assignment Problem (JAP) [30]. Then, JAP can be reduced in polynomial time to MTCP to complete the proof as followed.

The corresponding decision problem of Minimum Test Cost Problem (MTCP):

MTCP = { $\langle D, J, U, ST, W, H, T, t \rangle$ } D= (S,  $\delta$ , S<sub>0</sub>) is a directed tree.

J is a set of sub-problems in D.

U is a set of folk testers.

ST is a function form  $J \rightarrow R^+$ 

W is a function form  $U \rightarrow (0, 1]$ 

H is a function form  $U \rightarrow R^+$ 

T is a function form  $U \times J \rightarrow R^+$ 

And there is an assignment with due time at most t

## **Theorem 1**

Minimum Test Cost Problem is NP-Complete.

### Proof:

First, we show that MTCP belongs to NP. Given an instance of the problem, the verification algorithm checks that sum of trustworthy  $W_i$  of assigned sub-problems of every folk tester i of each sub-problem j exceeds the support threshold  $ST_j$ , the sum of the completion time of assigned sub-problems of each folk tester i does not exceed  $H_i$ , the assignment of the sub-problems differs from the other assignment of the sub-problems, and checks whether the maximum of the sum of the completion time of assigned sub-problems of each folk tester is at most t. This process can certainly be done in polynomial time.

Second, to prove that MTCP is NP-Hard, we show that  $JAP \leq_p$  MTCP. Let G=(V',E'),

J'={P<sub>i</sub>|i=1,...,n}, U'={U<sub>i</sub>|i=1,...,m}, d(i, j)=0, the confirm function S(k)  $\forall k \in P_i$ , the trustworthy function w by w(i, j) where i  $\in$ U'and j  $\in$ J', the human resource function H by H(i)  $\forall i \in$ U', the execution time function T by T(P<sub>i</sub>, j)  $\forall Pi \in$ J', j $\in$ U', and the maximum total cost at most t of JAP. We construct an instance of MTCP as follows. We form the tree D= (S,  $\delta$ , S<sub>0</sub>) where S=P<sub>i</sub>,  $\delta$ =0, S<sub>0</sub>=P<sub>i</sub> and we define the test sub-problem set J=J', the folk tester U=U', the support threshold function ST by ST<sub>j</sub>=1  $\forall j \in$ J, the trustworthy function W by W<sub>i</sub>=w(i,j)  $\forall i \in$ U, the available time function H by H<sub>i</sub>=H(i)  $\forall i \in$ U, the completion time function T by T(i, j)=T(Pi, j)  $\forall i \in$ U,  $\forall j \in$ J.

The instance of MTCP is then <D, J, U, ST, W, H, T, t>, where is easily formed in polynomial time.

We now show that graph G' has an assignment  $\delta$  of the maximum total cost at t if and only if the tree D' has an assignment $\sigma$ ' of the maximum due time at most t. Suppose there is an assignment $\delta$ with maximum cost at most t. Therefore, there exists an assignment  $\sigma$ ' such that  $\sigma_{ijk} = 1$  if  $\delta_{ij} = 1$ , the support threshold  $ST_j=1 \forall j \in J$ , the trustworthy weight of folk tester  $W_i=w(i,j) \forall i \in U$ , the available time  $H_i=H(i)$ , the completion time  $T(i, j)=T(P_{i,j}) \forall i \in U$ ,  $\forall j \in J$ . Thus, the assignment  $\sigma$ ' is feasible solution and the maximum due time is t. Conversely, suppose that there is an assignment  $\sigma$ ' with the maximum due time is t. Then, there existed an assignment a such that  $\delta_{ij} = \sigma_{ijk}$ , the trustworthy  $w(i, j)=W_i \forall i \in U'$  and  $j \in J'$ , the human resource  $H(i)=H_i \forall i \in U'$ , the execution time  $T(P_i, j)=T(i,j) \forall P_i \in J'$ ,  $\forall j \in U'$ . Thus, the assignment is a\_feasible solution and the maximum total cost is t. Hence, MTCP is NP-Complete #

## 4.3 Dynamic stubbing algorithm for Minimum Test Cost Problem

Because Minimum Test Cost problem (MTCP) is an NP-Complete problem, we propose heuristic approach to solve MTCP. First heuristic is to assign new coming tester the job which requires the most effort to compete. This heuristic can speed up the whole testing. However, the sub-problem completion time of different folk testers is distinct. Therefore, we further predict the completion time to balance the following job assignments. Second heuristic is to assign tester with high trustworthy the most doubting job. Since the quality of folk testers is not the same, there may be opposite result on the same sub-problem. The second heuristic is used to improve the quality of test report.

Before presenting our heuristic-based approach, the used notations are introduced in Table 7. U represents the set of the folk testers, and W<sub>i</sub> represents the trustworthy of the  $i_{th}$ folk tester. M<sub>j</sub> represents the complexity of  $j_{th}$  sub-problem. S<sub>j</sub> represents the testing support of the  $j_{th}$  sub-problem and ST<sub>j</sub> represents the support threshold of the  $j_{th}$  sub-problem. T<sub>A</sub>(i, j) stands for the actual execution time of the  $j_{th}$  sub-problem done by the  $i_{th}$  folk tester, and T<sub>Ev</sub>(i, j) stands for the evaluation time of the  $j_{th}$  sub-problem done by the  $i_{th}$  folk tester. F<sub>P</sub>(S<sub>k</sub>) represents the average trustworthy of folk testers which report bugs at the state k, and F<sub>N</sub> (S<sub>k</sub>) represents the average trustworthy of folk tester which don't report bugs at the state k. The details of these notations and the following proposed dynamic stubbing algorithm are listed below: Table 7. Notations of Dynamic stubbing algorithm

Folksonomy user:

 $U = \{i \mid i \text{ is the } i_{th} \text{ tester}\}$  is a set of folk testers

Trustworthy weight of the ith folk tester:

 $W_i \in (0, 1]$ 

Complexity:

M<sub>j</sub>=#line of code in sub-problem j

Support of the j<sub>th</sub> sub-problem:

$$S_{j} = \sum_{i} (T_{A}(i, j) - (T_{Ev}(i, j)) * W_{i})$$

Support threshold weight of the  $j_{th}$  sub-problem:

 $ST_j=M_j*c$ , where c is a constant

Actual execution time of the  $j_{th}$  sub-problem, which had done by the  $i_{th}$  folk tester:

$$T_A(i, j) \in \mathbb{R}^+$$

Evaluation time of the  $j_{th}$  sub-problem by the  $i_{th}$  folk tester:

$$T_{Ev}(i, j) \in \mathbb{R}^+$$

Average trustworthy weight of folk testers which report bug at the state k

 $F_{P}(S_{k}) = \frac{1}{|U_{t}|} \sum_{i \in U_{t}} W_{i}$ , where U<sub>t</sub> is the set of folk tester report bugs at the state k

Average trustworthy weight of folk testers which don't report bug at the state k

 $F_{N}(S_{k}) = \frac{1}{|U_{t}|} \sum_{i \in U_{t}} W_{i}$ , where U<sub>t</sub> is the set of folk tester don't report bugs at the state k

## **Dynamic stubbing algorithm**

Input:

**User Profile**  $T_{Ev}(i, j)$ :evaluation time of sub-problem j of tester i State Transition Diagram  $D=(S, \delta, S_0)$ S (PR): a set of all sub-problems PR: a set of sub-problems Output: Testing time Method: Initial: PR=null, for each sub-problem j in S (PR) InitialMetadata(j) Step1: for each sub-problem in S (PR) find the set of sub-problem S (PR) which the most required tested 1.1: PR=FindTestedProblem(S (PR)) Step2: GuidingTester(PR,Ui) Step3: IF the  $j_{th}$  sub-problem of the  $i_{th}$  tester has done 3.1: updating  $S_j=S_j + (T_A(i, j)-T_{Ev}(i, j))*W_i$ Step4: IF  $(S_j > ST_j, \forall_j)$ **Testing Finish** ELSE Go to step1

## Subroutine: InitialMetadata

Input: Sub-problem j

Output: Sub-problem j'

Method:

Step1: According to the code complexity of j set up the ST<sub>j</sub> of sub-problem j

 $ST_j \mathop{{{\text{-}}}} X$ 

S<sub>j</sub> <- 0

Step2: return j'

# Subroutine: FindTestedProblem

```
Input: S (PR): a set of all sub-problems

Output: a set of sub-problem PR

Method:

Initial: B=S (PR)

Step1: for each problem j in B

1.1: T (j) = (\text{length } (j) + 1) [(S_j/ST_j) + \alpha \sum_{j.k \in sub-problem(j)} T(j)]

Step2: for n=1 to count (U<sub>i</sub>)

2.1: add arc min{T(j)} into PR

2.2: remove j

Step3: return PR
```

## Input:

State transition diagram D

F: all user profile

A set of sub-problem PR

A set of folk tester  $U_i$ 

Output:

Method:

Initial: B=PR

Step1: for each sub-problem j in PR

Return arc 
$$\min_{j} \{ \sum_{k} (F_P(S_k) - F_N(S_k)) | S_k \in j \}$$

Step2:

2.1: IF B≠null

Assign j to the most trustworthy of tester i in U<sub>i</sub>

ELSE

Assign arc  $\max_{j} \{length(j)\}$  to the tester i in U<sub>i</sub>

2.2:  $S_j = S_j + T_{Ev}(i,j) * W_i$ 

Step3: According to j from left to right

3.1: apply D and F to assign input value which is not tested to the Tester

3.2: for each link L in the tested page

Block link button except the link of entering to the next tested page.

3.3: remove i from U<sub>i</sub>

3.4: remove j from B

Step4: repeat step1 until U<sub>i</sub> is null

# **Chapter 5 Implementation and Experiment**

## 5.1 System architecture and implementation

## 5.1.1 System architecture

In this section, we propose our two-phase collaborative testing system architecture including preprocessing phase and testing phase, as shown in Figure 13. In phase I, we convert the ASP.NET with C# language of the web applications into value-oriented dependence graph by value-oriented dependence graph construction algorithm. And then, we transform value-oriented dependence graph into state transition diagram for problem decomposition by considering users' runtime behaviors. In phase II, according to the state transition diagram, the tester profiles and portfolios, dynamic stubbing algorithm assigns jobs to each new coming tester. After the testing finishing, we analyze these bugs which folk testers reported based on report analysis algorithm.

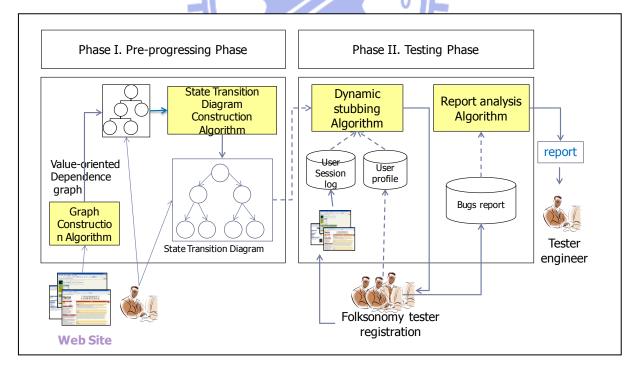


Figure 13. Intelligent collaborative testing system architecture

## 5.1.2 System implementation

We implement a prototype system, intelligent collaborative testing system (ICTS), to support collaborative testing. When using ICTS, new tester has to register by filling out a simple questionnaire. This questionnaire can be used to estimate the trustworthy of tester and the completion time of each sub-problem. The screenshot of register page of ICTS is shown in Figure 14. The tutorial of ICTS, shown in Figure 15, is provided for testers to understand how to test on ICTS. After understanding how to test on ICTS, testers can start to test Web-site. ICTS guides testers to test state of the most required and sets all values of tainted variables in branch predicate for testers. The guide of ICTS, shown in Figure 16, the main frame is the current tested page and the left column records tester's feedback on current page. Finally, complete information, shown in Figure 17, occurs if the test criterion is met.



1.	測試者請先登入,還沒有註冊帳號請先註冊 帳號: 密碼: 登入 註冊
	帳號: May Register testing account
	密碼:xxxx 確認密碼:xxxx
	平均每天上網時間: 3小時~5小時 ▼ 職業: 研究生 請正確塡寫
	專長: 打電腦 請正確填寫 性別: 女 ▼
	年齡: 20~25 ▼
2.	測試者請先登入,還沒有註冊帳號請先註冊 帳號:May 密碼: xxxx
	註冊成功 Register successfully and login

Figure 14. Screen shot of register page of ICTS

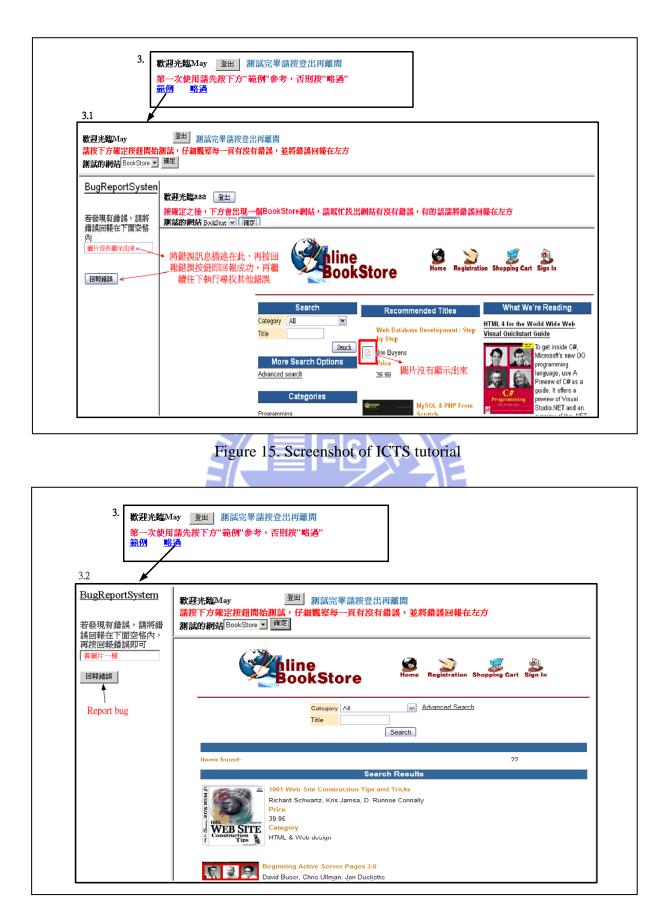


Figure 16. Screenshot of ICTS guiding

4.	
BugReportSystem	<b>歡迎光臨</b> May 請按下方確定按鈕開始測試,仔細觀察每一頁有沒有錯誤,並將錯誤回報在左方
 若發現有錯誤,請將錯 誤回報在下面空格內,	新訳的網站 BookStore ▼ 僅定
再拨回報錯誤即可	測試結束
回報錯誤	

Figure 17. Screenshot of complete information of ICTS

# 5.2 Experimental design and results

## 5.2.1 Experimental design

We demonstrate our proposed approach on a open source Web application "BookStore" [http://www.gotocode.com/], which contains nine pages (AdvSearch page, BookDetail page, Books page, Default page, Login page, MyInfo page, Registration page, ShoppingCart page, and ShoppingCartRecord page). We convert "BookStore" into value-oriented dependence graph by the value-oriented dependence graph construction algorithm, and then transform value-oriented dependence graph into state transition diagram. The corresponding statics of value-oriented dependence graph of "Bookstore" are provided in Table 8, respectively. And then we transform value-oriented dependence graph into state transition diagram with 28 states.

Level	Туре	Quantity
Page Level	Node	9
	Edge	52
Function Level	Node	146
	Edge	136
Code Level	Node	351
	Edge	546
Total	Node	506
	Edge	734

Table 8. Value-oriented dependence graph statistics

In the experimental design, we design a real testing environment of the web application "BookStore". The folk testers of this experiment are gathered via social network sites such as Facebook and msn. Therefore, these folks have basic internet access skills. The ages of testers are between 15 and 30. These folk testers are further split into control group (85 testers) and experimental group (59 testers). The testing periods of control group and experimental group are 2011/6/1~2011/6/6 and 2011/6/1~2011/6/3, respectively. The stopping criterion of these tests is that the support of each state exceeds its support threshold.

## **5.2.2 Experimental results**

## **Experimental result I-Efficiency evaluation**

Centralized preferences of folk testers are the major cause of the delay of collaborative testing. Figure 18 shows that folk testers in control group prefer to test the first state and then second, 6<sup>th</sup>, 10<sup>th</sup>, 14<sup>th</sup>, 20<sup>th</sup>, 21<sup>th</sup> and 22<sup>th</sup> state. Compared to control group, our proposed intelligent collaborative testing system can reduce this kind of bias. Table 9 shows that experimental group has much less standard deviation in state complete degree than control group (0.2928 v.s. 0.9268). This points out that our proposed algorithm can balance the job assignment.

Group	Mean	S.D.
Experimental group	0.6907	0.2928
Control group	0.9404	0.9268

Table 9. State complete degree of testing comparing

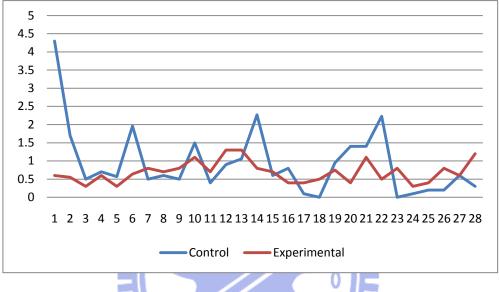


Figure 18. Comparison of state complete degree of testing

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Table 10 shows the average contribution (test time) of each folk tester on this experiment. We further apply independent t-test on control group and experimental group. There is no significant difference (p=0.1240) in contribution of each folk tester between control and experimental groups. In fact, testers in experimental group contribute less. Table 11 shows the comparison of unit number of online folk testers of control group and experimental group. This result shows that the contributions of testers in unit time of two groups are the same. According to the above results, these experiments are fair for experimental group and control group. Based on these fair comparisons, the due time of the experimental group can be reduced to 50% of the control group, shown in Figure 19. Hence, our proposed dynamic stubbing algorithm can speed up collaborative testing.

Group	Ν	Mean	S.D.	p-value
Experimental group	59	150.6271	236.1593	0.1240
Control group	85	244.5647	482.3225	

Table 10. Comparison of test time between two groups

# Table 11. Comparison of the folk testers per due time

	Control group	Experiment group
Folk testers/Due time	0.0050	0.0061

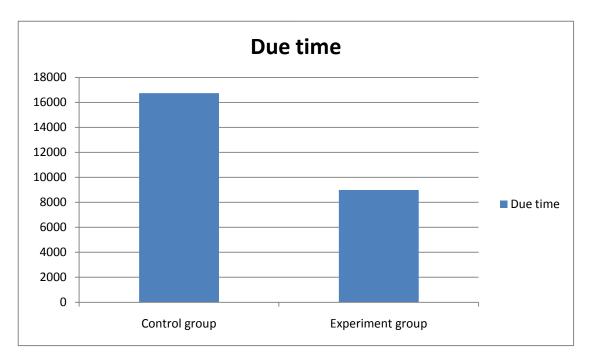


Figure 19. Due time comparison

## **Experiment result II -Effectiveness evaluation**

Fault-detection ability is the most important in software testing, especially in collaborative testing. Unqualified folk testers may produce doubt reports, and hence it requires advanced job assignment and report analysis algorithm to improve the quality of final report. In this experiment, there are ten defects in Web application "BookStore" as shown in Table 12, including the same book image error, notes of book error, category shows error, vote image error, vote rate error, E-mail error, total price error, total price of book error, modify quantity error, and last\_name and E-mail error.

	Defect description	Page
1	the same book image error	Default
2	notes description of book error	Default
3	category shows error	Books
4	vote image error	BookDetail
5	vote rate error 1896	BookDetail
6	E-mail error	ShoppingCart
7	total price error	ShoppingCart
8	total price of book error	ShoppingCart
9	modify quantity error	ShoppingCartRecord
10	last_name and E-mail error	MyInfo

Table 12. Ten defects in Web application "BookStore"

Web application testing problem can be treated as binary classification problem where pages with defect are positive instances and normal pages are negative instances. Each folk tester can be considered as a classifier and our proposed system is an advanced classifier integrating every classifiers. Table 13 shows the comparison of processing time of each folk tester on each state. Folk testers in experimental group spend less time to check the status of each state. However, there is no significant difference (p=0.0845) between control and experimental groups when applying impendent t-test. The proxies of fault-detection ability are selected as true positive rate (TP), true negative rate (TN), false positive rate (FP), false negative rate (FN), precision, recall and F-measure. Table 14 shows the comparison of the fault-detection ability between control group and experimental group. There is no significant difference in TP (p=0.4170), TN (p=0.6019), FP (p=0.8474), FN (p=0.5518), Recall (p=0.6655), Precision (p=0.9321), and f-measure (p=0.7233) between two groups. These results indicate that folk testers in control group and experimental group have similar fault-detection ability. However, the large stand derivation of each proxy indicates that the quality of folk testers varies much. For example, there are almost 70% testers with fault-detection ability (precision) from 0 to 1. This indicates that there exists folk testers with prefect fault-detection ability and none fault-detection. From this observation, it requires report analysis algorithm to form high quality test report.

When forming the final report, our report analysis algorithm adopts winner-takes-all strategy, where the prediction of each state relies on the group with higher average trustworthy. Based on the above comparisons, control group and experimental group have similar fault-detection ability. Table 15 shows that our proposed approach can improve 30% fault-detection ability than traditional collaborative testing.

Group	Ν	Mean	S.D.	p-value
Experimental group	59	22.0596	17.9834	0.0845
Control group	85	29.5177	33.1721	

Table 13. Comparison of test time of each state between two groups

Table 14. Comparison of fault-detection ability between two groups

Group	Experimental group		Control group		p-value
	Mean	S.D.	Mean	S.D	
ТР	0.2236	0.2927	0.1867	0.2263	0.4170
TN	0.4056	0.2988	0.4317	0.2887	0.6019
FP	0.0394	0.1555	0.0441	0.1295	0.8474
FN	0.2973	0.2756 E	S 0.3255	0.2836	0.5518
Recall	0.3325	0.3885	0.3051	0.3515	0.6655
Precision	0.4918	0.4950	0.4848	0.4708	0.9321
f-measure	0.3785	0.4110	0.3546	0.3771	0.7233

Table 15. Fault-detection ability of two collaborative testing approaches

	Control group	Experimental group
ТР	0.3214	0.4285
TN	0.3571	0.4642
FP	0.1428	0.0357
FN	0.1785	0.0714
Recall	0.6429	0.8571
Precision	0.6923	0.9230
F-measure	0.6666	0.8888

# **Chapter 6 Conclusion**

In our thesis, we first propose the value-oriented dependence graph which is a fine-grained Web application model. And then, based on value-oriented dependence graph, we further propose a novel Web application model, state transition diagram, for supporting problem decomposition and further advanced job assignment algorithm. We also formulate Minimum Test Cost Problem (MTCP) in collaborative testing by considering the constraints of real environment, and prove that MTCP is an NP-Complete problem. Finally, we propose a heuristic-based dynamic stubbing algorithm to solve MTCP and implement a two-phase intelligent collaborative testing system by applying dynamic stubbing technique. This technique allows folk testers contributing their human resources with barely noticing varying test environment. Therefore, it would not influence the willingness of folk testers to contributing themselves. The experimental results show that out proposed approach can reduce 50% due time and improve 30% fault-detection ability in collaborative testing.

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