Identifying Code of Individual Features in Client-side Web Applications

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Abstract—Web applications are one of today's fastest growing software systems. Structurally, they are composed of two parts: the server-side, used for data-access and business logic, and the client-side used as a user-interface. In recent years, with developers building complex interfaces, the client-side is playing an increasingly important role. Unfortunately, the techniques and tools used to support development are not as advanced as in other disciplines. From the user's perspective, the client-side offers a number of features that are relatively easy to distinguish. However, the same cannot be said for their implementation details. This makes the understanding, maintenance, and reuse of code difficult. The goal of the work presented in this paper is to improve reusability, maintainability and performance of client-side web applications by identifying the code that implements a particular feature. We have evaluated the approach based on three different experiments: extracting features, extracting library functionalities, and page optimization. The evaluation shows that the method is able to identify the implementation details of individual features, and that by extracting the identified code, a considerable reduction in code size and increase in performance can be achieved.

Index Terms-Web applications, Feature location, Program Slicing, Code extraction

1 INTRODUCTION

THE web application domain is one of the fastestgrowing and most wide-spread application domains. Web applications are used in almost every facet of our lives: at work, as part of our social experience, or for e-commerce. From a structural perspective, web applications consist of two equally important parts: the server-side, realized as a procedural application implementing data-access and business logic and the client-side, realized as an event-driven application that acts as a user interface (UI). The client-side of a web application is developed with a combination of three languages based on entirely different paradigms: i) HTML, a markup language, for defining structure and content; ii) CSS, a style sheet language, for presentational aspects, and; iii) JavaScript, a scripting language, for the behavior. Alongside code, a web application includes resources such as images, videos and fonts. The interplay of these elements produces the result displayed in the browser.

In recent years, the client-side is playing an increasingly important role. By utilizing fast, modern browsers and advanced scripting techniques, developers are building highly interactive applications that can compete with standard desktop applications in terms of user-experience and responsiveness. This has led to the increased complexity of web appli-

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cations. Unfortunately, techniques and tools used to support development are not as advanced as in some other, more traditional software engineering disciplines. This is especially true of tools and methods for development, analysis, and reuse.

From the user's perspective, an application has a number of different features. A feature is implemented by a subset of the whole application's code and resources. However, identifying the exact subset is a challenging task: code responsible for the desired feature is often intermixed with irrelevant code, there is no trivial mapping between the source code and the application displayed in the browser. The ability to pinpoint the code and resources used for individual features facilitates the understanding, maintenance and reuse of that code.

The main contribution of this paper is a method for identifying and extracting code and resources that implement individual features in a client-side web application. In order to locate the implementation code, we have to be able to track dependencies between different parts of the application. To address this, we introduce a client-side dependency graph, show how it is constructed, and how it can be used to identify the code and the resources that implement a feature. In addition, we apply the approach in three different cases: extracting features, extracting library functionality, and page optimization. The evaluation of the results shows that the method is able to identify the implementation details of individual features, and that by extracting the identified code, considerable savings in terms of code size, and increased performance can be achieved.

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The paper is organized as follows: Section 2 describes the motivation and the background, and Sections 3-5 describe the overall approach to the identification process, define the dependency graph, and show how it is related to each step of the identification process. Section 6 describes the tool that implements the whole process, and Section 7 presents the evaluation. Finally, Sections 8 and 9 present related work and the conclusion.

2 BACKGROUND

In this section we motivate the usefulness of the approach and present a view on the client-side web application. We also give an introduction to the inner workings of client-side web applications and introduce feature location and program slicing – two techniques fundamental for our approach.

2.1 Motivation

The ability to exactly identify the source code and resources of a particular feature can be used to support a number of software engineering activities, such as program understanding, debugging, feature extraction and page optimization. While program understanding and debugging are important activities regardless of the application domain, feature extraction and page optimization are activities specific to the web application domain.



Fig. 1. Example web application: 1 - the news cycler UI control, 2 - buttons, 3 - image, 4 - captions.

Feature extraction – Consider a web application with a simple news slider – a part of the web application UI (marked with a dashed square in Figure 1) that allows the user to switch between a number of news items, where each item is represented by a large image (marked with 3), a caption and a link to the full news text (marked with 4); and where each change is accompanied by an animation. This is a fairly common feature and can be found in a large number of web applications. The feature manifests when a user clicks on a button (marked with 2 in Figure 1), which initiates a change of news items. The main image, the title and the link are faded out, and when the current elements completely disappear, the source of the image, the text of the title, and the link are changed with the data from the new news item. Next, the elements with the new data are slowly faded in. Once this effect is finished, the button with the index of the previous news item is visually marked as deselected, and the clicked button is visually marked as selected.

Consider a web developer trying to extract the news slider feature from the example application. This feature manifests at runtime when the user clicks on a button with the following changes to the UI: fading out of images, text, and links; changing their data; fading them in; and visually deselecting and selecting buttons. In order to extract the code and resources that implement the feature, the developer has to identify code and resources responsible for each of those changes. This is a difficult and time-consuming task: the developer has to go through several files containing different implementation languages (HTML, JavaScript, CSS) based on different paradigms, and exactly identify the code and resources defining each of the changes.

Page optimization – In client-side web applications, all code is transfered to and executed on the client. Large code bases lead to slower and less responsive web applications, which in turn increases the likelihood of users abandoning the application [17]. By identifying code that implements each application feature, we can identify code that is included in the application, but that does not contribute to any feature (dead code). By removing dead code, considerable savings in terms of page loading time, and increased performance can be achieved. This is especially true for web applications that use wide-spread client-side libraries (around 53% of all web applications [13]), since in order to increase their potential, library developers often include a wide range of features.

2.2 Client-side Web application conceptual model

In this section we present a conceptual model of client-side web applications (Figure 2) that will be used to define a mapping between a feature and the implementing code. A client-side application can be viewed as a collection of visually and behaviorally distinct UI elements (or UI controls). A UI control, even though it does not exist as a separate, standalone, easily identifiable entity in code, is defined with a certain structure, the presentational aspects of that structure, and its behavior.

Features – An application offers a number of features. The meaning of the term *feature* depends on the context. For example, the IEEE defines the term as [26]: a distinguishing characteristic of a system item (includes both functional and nonfunctional attributes such as performance and reusability), while in the



Fig. 2. Client-side web application conceptual model.

program understanding community a software feature is taken to be a specific functionality provided by the software that is accessible by and visible to the developers [21] [14] [24]. In our work we use the term *feature*, in accordance with [14], as an abstract description of a system's expected behavior that manifests itself at run-time, when the user provides the system with adequate input.

Scenarios – Since client-side web applications are UI applications, a user who wants to invoke a certain feature of the system has to provide the application with adequate input – a sequence of user actions. Such sequences of user inputs that trigger actions of a system with observable results are called scenarios [14].

Since client-side applications are UI applications to the server-side, a feature manifests through a number of structural changes on the client-side and/or communications with the server-side. Since a UI control encapsulates structure and the behavior on that structure, we define that a single feature is implemented by at least one UI control (Figure 2). A UI control can, in general, implement any number of features.

Example. In the example application (Section 2), the feature of cycling between news items is implemented by a UI control (Figure 1, mark 1). When the user performs a scenario consisting of a single input: clicking on a button, the feature manifests with a series of changes to the structure of that UI control.

In the next subsections we will go into more details about the inner workings of client-side web applications that are necessary to understand the process of identifying code and resources of individual features. We will also give a short introduction to feature location and program slicing, techniques that are an integral part of our approach.

2.3 Web application primer

A client-side web application is an HTML page that includes JavaScript code, CSS code, and various resources (e.g. images and fonts). The HTML code defines the structure, JavaScript code the behavior, and CSS code the presentation. The interplay of these elements produces the result displayed in the browser. JavaScript is a weakly typed, imperative, objectoriented scripting language with prototype based inheritance. It has no type declarations and has only run-time checking of calls and field accesses. Functions are first-class objects and can be manipulated and passed around like other objects. JavaScript is a dynamic language: everything can be modified at runtime, from fields and methods of an object to its prototype. The language also offers an eval function which can execute an arbitrary string of JavaScript code.

CSS is a declarative language used to specify the presentational aspects of HTML elements. The CSS code is composed of CSS rules, each rule consisting of a CSS selector and a set of property-value pairs. A CSS selector is used to specify to which HTML elements the given property-value pairs will be applied.

Client-side web applications are event-driven UI applications and a majority of their code is executed as a response to user-generated events. Their life-cycle can be divided into two phases: *i*) page initialization and *ii*) event-handling. The purpose of the page initialization phase is to build the UI of the web page. The browser achieves this by parsing the HTML code and building a representation of the HTML document – the Document Object Model (DOM). When parsing the HTML code the DOM is constructed one HTML element at a time. There are two special types of HTML elements that the browser can encounter: *i*) style and link elements that include CSS code and *ii*) script elements that include JavaScript code.

When the browser reaches a style or a link element, it parses the CSS code and constructs a set of presentational rules; and when it reaches a script element, the browser suspends the DOM building and enters the JavaScript interpretation. One important purpose of the interpreted code is to register event-handlers, which define how events are handled during the second phase of the execution. Once the code is executed, the process resumes the DOM building phase.

After the last element is parsed and the UI is built, the application enters the event-handling phase, where code is executed in response to events. All UI updates are done by JavaScript modifications of the DOM, which can go as far as completely reshaping the DOM or even modifying the code of the application.

At any time, the client-side application can initiate communication with the server-side without interfering with the display of the current page. This approach to client-side development is often termed AJAX (Asynchronous JavaScript and XML; but despite the name the communication does not need to be asynchronous, nor does XML have to be used).

2.4 Feature Location

The goal of our approach is to locate the implementation details of a particular feature. This process is known as feature (or concept) location [18][19]. The most common types of analyses, used by feature location processes, include textual analysis, static analysis, and dynamic analysis (and their combinations). Textual approaches analyze the source code text based on the idea that identifiers and comments encode domain knowledge, and that a feature may be implemented using a similar set of words throughout the system. Static analysis examines structural information such as control or data flow dependencies, for all possible program inputs, often overestimating the code related to a feature [21]. Dynamic analysis, on the other hand, relies on examining the execution of an application, and it is often used for feature location when features can be invoked and observed during runtime. Feature location using dynamic analysis generally relies on execution trace analysis, and feature-specific scenarios are developed that invoke only the desired feature. Then, the scenarios are exercised and execution traces that record information about the code that was invoked are collected. Dynamic analysis for feature location is often used [14] [20] since most features can be mapped to execution scenarios. However, there are some limitations associated with dynamic analysis the scenarios used to collect traces may not invoke all of the code that is relevant to the feature, meaning that some of the feature's implementation may not be located [21].

In the client-side domain, features are implemented through the interplay of HTML, CSS, and JavaScript code. This means that, in addition to all difficulties inherent in the feature location process, the clientside feature location also has to take into account the dependencies that exist between different parts of web application code.

2.5 Program Slicing

Program slicing [5] is a method that starting from a subset of a program's behavior, reduces that program to a minimal form which still produces that behavior. A program slice consists of the parts of a program that affect the values computed at a point of interest - the slicing criterion. A program can be sliced statically [5], for all possible program inputs, or dynamically [6], for specific program inputs. A static slicing criterion is usually specified by a program point and a set of variables, while a dynamic slicing criterion is typically composed of an input, the occurrence of program statement, and a set of variables. Slicing can be a very powerful technique, but it requires starting slicing criteria, and there may be no easy way to identify slicing criteria that correspond to a user-described feature.

In the client-side domain, slicing has certain specifics: *i*) it has to be performed across three different languages (HTML, CSS, and JavaScript); and *ii*) since client-side applications are UI applications,

the slicing does not have to be performed only to keep parts of a program that affect the values computed at a point of interest – slicing can also be used to keep only parts of the application's UI.

3 THE IDENTIFICATION PROCESS

The goal of our approach is to identify code and resources that implement a client-side feature invoked by a scenario. Since a feature is something abstract that manifests at runtime triggered by a scenario, and is implemented by a number of UI controls – in order to identify the implementation of a feature, we have to identify the implementation details of UI controls participating in the scenario.

When executing a scenario, a feature is manifested as a sequence of: *i*) UI modifications to the structure of the implementing UI controls, and/or *ii*) server-side communications from the structure of the implementing UI controls. These structural changes and serverside communications represent UI control behavior in a particular scenario and we refer to them as *feature manifestations*. A feature manifestation matches an evaluation of a JavaScript expression executed when demonstrating a scenario, an evaluation that either modifies the structure of the page or communicates with the server-side. Feature manifestations, in essence, cause the manifestation of a feature.

One of the key insights that we use in this process is: in order to identify the whole code that implements a feature in a scenario, we have to identify both the feature manifestations and the code responsible for each feature manifestation (in essence, we have to perform dynamic slicing for each feature manifestation). Since a feature manifests when a user performs a certain scenario, feature manifestations can only be known dynamically – we base the approach on the analysis of the execution trace recorded while executing scenarios.

The main advantages of the approach are: *i*) it does not require any formal specification of the feature (something that is rarely done in web application development) – the user can easily specify exact feature behavior; and *ii*) it enables us to dynamically track code dependencies (something that can not be accurately done statically for a language as dynamic as JavaScript). The downsides are: *i*) the approach is primarily suited for functional features, such as robustness, security, or maintainability do not have determinable feature manifestations); and *ii*) the accuracy and the completeness of the captured feature is dependent on the quality of the scenarios.

Scenarios are an integral part of our approach and in the current process they have to be set up manually by a user. We assume that the user understands the behavior of the target feature (i.e. is aware of different sets of input that trigger feature variation), and knows which features are invoked by a scenario. This may require knowledge of the internal details of the system. This is in line with the assumptions presented in [14]. However, the scenarios could potentially be generated with a test case generation process (e.g. [22], [23], [35]).

In order to identify the implementation of a certain feature, we have to track dependencies between different parts of the application. For this reason, we have defined a *Client-side Dependency Graph*, which is the main artifact used in the process. The overall process is shown in Figure 3 and consists of two phases: *Interpretation* and *Graph Marking*.



Fig. 3. Identifying code and resources of a feature based on a scenario.

Phase 1 – *Interpretation* – receives as input the whole web application code, an event trace of the scenario that causes the manifestation of the desired feature, and a set of UI control selectors. A UI selector is either a CSS selector¹ or an XPath expression² that specifies root HTML elements of the UI controls that implement the feature. The goal of this phase is to build the client-side dependency graph, and the process does that by interpreting the whole application with the event trace as a guideline. During the interpretation phase, as code is being executed, matching nodes with all their dependencies are created and inserted into the graph. When the interpretation process reaches a point in the application execution (i.e. evaluates a code expression) that represents a feature manifestation, that point is stored.

In Phase 2 - Graph marking - by traversing the

2. http://www.w3.org/TR/xpath/

dependency graph for every HTML node of every specified UI control and for every feature manifestation, all code and resources that directly or indirectly contribute to the demonstrated feature are marked. In essence, the graph-marking phase performs dynamic program slicing using the HTML nodes of the specified UI controls and feature manifestations as slicing criteria. If we merge all computed slices – serialize the marked code and download resources from those marked nodes, we end up with a subset of the original application which is still able to reproduce the scenario – the implementation of a feature, for this particular scenario, is identified and extracted.

User's perspective

In order to facilitate the feature identification process we have developed a plugin for the Firefox browser that enables the user to select the UI controls in the web application and record the events demonstrated by the user. Next, the plugin determines the UI control selectors of the selected UI controls, accesses the client-side code of the web application and starts the whole process. In the end the user receives the code and resources of the feature demonstrated by the scenario and implemented by the selected UI controls.

Technical perspective

The Firefox plugin used to select UI controls and record user demonstrated events contains a modified JavaScript interpreter³ that, in addition to evaluating JavaScript expressions, tracks the relationships between expression values and code constructs. The interpreter is executed within the web browser and has access to all browser features (e.g. obtaining DOM element properties, relating CSS rules and matching HTML nodes). The JavaScript interpreter executes code according to standard rules of JavaScript interpretation, which means that at any point of execution, it is aware of the complete application state. This enables us to track data and control dependencies during the evaluation of web application code and precisely determine when an expression that manifests the behavior is evaluated.

3.1 Example

In the following sections we will illustrate the identification process with a running example shown in Listing 1.

This very simple web application has two features: *i*) it enables the user to mark an image as a favorite and sends that decision to the server; and *ii*) displays the message returned from the server (note that they could also be considered as a single feature, but in this example, for the sake of presentation, we will consider them as separate). Both features are triggered by the

3. https://github.com/jomaras/Firecrow

^{1.} http://www.w3.org/TR/CSS2/selector.html

```
/*01*/<html>
/*02*/ <head>
/*03*/
        <stvle>
/*04*/
         .fav{background-image: url("fS.png");}
/*05*/
         .noFav{background-image: url("nS.png");}
/*06*/
        #star { width: 32px; height: 32px; }
/*07*/ </style>
/*08*/ </head>
/*09*/ <body>
/*10*/
       <div class="imageRaterContainer">
/*11*/
        <img alt="Image" src="atom.png"/><br/>
        <div id="star" class="noFav">Note</div>
/*12*/
/*13*/
        </div>
/*14*/ <div id="notif"></div>
/*15*/<script>
/*16*/ var star=document.getElementById("star")
/*17*/ var notif=document.getElementById("notif")
/*18*/ star.onclick = function () {
/*19*/ var dec = star.className == "noFav"
    ? "fav" : "noFav";
/*20*/ star.className = dec;
/*21*/ var req = new XMLHttpRequest();
/*22*/ req.open("GET", "d.php?d="+dec, false);
/*23*/ req.send();
/*24*/ notif.textContent = req.responseText;
/*25*/};
/*26*/</script>
/*27*/</body>
/*28*/</html>
```

Listing 1. Example application

scenario in which the user, by clicking on the star (div element with the id *"star"*), toggles the image as a favorite. On each click, a request is sent to the server with the information about the state of the star.

The UI of the application is composed of two containers: the first (*imageRaterContainer*) is used as a container for the image element and the star element and defines the structure related to the first feature; the second (*notif*) is used for displaying status messages returned from the server and defines the structure related to the second feature.

From the point of view of the application's behavior, there are three crucial JavaScript expressions in Listing 1: lines 20, 23, and 24; expressions that directly modify the DOM of the page (lines 20 and 24) or communicate with the server side (line 23). From the feature point of view: expressions in lines 20 and 23 contribute to the behavior of the first feature, and the expression in line 24 to the behavior of the second feature. Our approach is, in essence, dealing with the identification of such feature manifestation expressions, determining whether or not they are important from the perspective of the selected feature, and then performing dynamic program slicing with those expressions as slicing criteria. In order to be able to perform dynamic program slicing, we have to have a way of capturing dependencies. This is usually done with a dependency graph. For this reason, in the next section, we define a client-side dependency graph that is capable of capturing dependencies in a multi-language, multi-paradigm environment that is the client-side of the web application.

4 THE DEPENDENCY GRAPH

The client-side is composed of four different parts: CSS, HTML, JavaScript, and resources that are intertwined and must be studied as a part of the same whole. Because of this, we define the clientside dependency graph as consisting of four types of nodes: HTML nodes, CSS nodes, JavaScript nodes, and resource nodes; and three types of edges: structural dependency edges, data flow edges, and control flow edges. Also, since the client-side of the web application is extremely dynamic (e.g. new HTML elements are regularly created by JavaScript code and inserted into the DOM of the application, but also new JavaScript and CSS code can be dynamically created with JavaScript code), for each node type we also differentiate between static (directly present in the source code) and dynamic nodes (dynamically constructed with JavaScript code).

Dependency	Notation	Condition		
Structural	$n_2 \longrightarrow n_1$	$n_{ m 2}$ is a child of $n_{ m 1}$		
Data	n> j	data in <i>n</i> is written by <i>j</i>		
Data	j→ n	j reads data from n		
Data	(h)→ [c]	the style of <i>h</i> is defined in <i>c</i>		
Data	n> r	n reads data from resource r		
Control	j ₂ ;; j ₁	Execution of j_2 depends on j_1		

Fig. 4. Edges in the client side dependency graph

Figure 4 shows the definition of different edge types. A straight, solid arrow represents structural dependencies, a straight, dashed arrow data dependencies, and a curved, dotted arrow control dependencies; h denotes HTML nodes, j JavaScript nodes, c CSS nodes, r resource nodes, and n denotes a node of arbitrary type. Because of the inherent hierarchical organization of HTML documents, the HTML layout translates very naturally to a graph representation. Except for the top one, each element has exactly one parent element, and can have zero or more child elements. The parent-child relation is the basis for forming dependency edges between h-nodes. A directed structural dependency edge between two hnodes represents a parent-child relationship from a child to the parent. HTML elements can include different resources (e.g. images, videos, sounds) so there can exist structural dependency edges between an rnode and an h-node.

CSS rules are represented with c-nodes. All CSS

code is contained within an HTML element, so each cnode has a structural dependency towards the parent h-node. Also, since a CSS style can be created with JavaScript code, there can exist a data dependency between a c-node and a j-node. CSS styles often reference resources such as images (e.g. defining the background of an HTML element), so there are data dependencies between c-nodes and r-nodes. Since the main goal of a CSS style is to define styling parameters for HTML elements, there can exist a data dependency between an h-node and a c-node.

JavaScript code constructs that occur in the program are represented with j-nodes (a simplified Abstract Syntax Tree). All JavaScript code is contained in an HTML element, so each j-node has a structural dependency towards the parent h-node. Two j-nodes can also have structural dependencies between themselves denoting that one construct is contained within the other (e.g. a relationship between a function and a statement contained in its body). Data dependency edges can be formed between j-nodes and all other types of nodes: a data dependency from one j-node to another denotes that the former is using the values set in the latter; an edge from a j-node to an h-node, that JavaScript code is reading data; while an edge from the h-node to the j-node means that JavaScript code is writing data to the HTML element. An edge from a jnode to a c-node means that JavaScript code is reading data from CSS code. A j-node can also have a control dependency towards another j-node (e.g. statements in an if-statement towards the if-statement condition).

Example. Figure 5 shows the full dependency graph built while interpreting the web application code presented in Listing 1 based on the execution trace recorded while demonstrating a scenario that will be described in Section 5.1. Circles represent h-nodes, squares c-nodes, trapezoids r-nodes, and rectangles j-nodes. The numbers near each node represent the id of the node; solid lines represent structural dependencies, straight, dashed lines represent data dependencies, and curved dotted lines represent control dependencies.

In the following section we will describe how the graph is created and traversed to identify the implementation code of a feature in a scenario.

5 IDENTIFICATION PROCESS – DETAILED DESCRIPTION

The process of identifying feature code consists of two phases, and is centered around the client-side dependency graph (Algorithm 1).

As input, Algorithm 1 receives the whole code of the web application, the event trace representing the scenario, and a set of selectors for HTML elements that define the UI controls which implement the feature (CSS selectors or XPath expressions). In the first two lines, two global variables – an empty graph

Algorithm 1 Code Identification

1:	function IDENTIFYCODE(<i>code</i> , <i>eventTrace</i> , <i>selectors</i>)
2:	global $dGraph \leftarrow empty graph$
3:	global <i>fManfs</i> \leftarrow []
4:	interpret (code, eventTrace, selectors)
5:	markGraph(selectors)
6:	end function

(*dGraph*) and an empty array *fManfs* are initialized. The purpose of the *fManfs* array is to hold the information about all feature manifestation points that were encountered while interpreting the application. The feature manifestation points and the h-nodes that define UI controls (specified with selectors) are the basis for traversing the graph in the graph marking phase (*markGraph*). We start the more detailed description in the next section, by explaining how the event execution trace is obtained.

5.1 Obtaining event traces

Due to the dynamicity of client-side applications the process is based on the analysis of the event trace recorded while demonstrating scenarios designed to invoke certain application features. The event-trace specifies the flow of the application, and while the user demonstrates the scenario, all raised events are logged. In general, the event trace captures all relevant information about executed events (e.g. mouse positions, key presses, the values of input elements). From a technical perspective, we obtain the event trace with a plugin to the Firefox browser which communicates with the JavaScript interpreter. Using this information, it is possible to determine the function called as an event handler, the event handling arguments, and the control-flow of the application.

Example. The developer wants to identify code and resources that are responsible for the implementation of the first feature (marking the image as favorite and sending the decision to the server). The developer selects the structure of the feature (*imageRaterContainer*) and demonstrates the following scenario: clicks on the empty star, causing it to change into a full star and send a message to the server. Listing 2 shows the event trace in JSON [12], generated by the specified scenario on the example application from Listing 1. In this case, Listing 2 shows a trace with a single triggered event - a click on an HTML element whose position in the page structure at the time of event handling is defined with an XPath expression (the div element with the id "star"). By using the information about the node the event was raised on (thisValue, *originalTarget, currentTarget*), the event parameters (e.g. *clientX*, *clientY*), and the starting code line of the event handler function (*line*), it is possible to determine the event handling function, and in turn establish the control-flow of the application.



Fig. 5. Dependency graph of the web application from Listing 1.

```
{[{
   "filePath": "example.html",
   "line": 19,
   "currentTime": 1346312751631,
   "thisValue": "/html/body/div/div",
   "args": {
      "target": "/html/body/div/div",
     "originalTarget": "/html/body/div/div",
"currentTarget": "/html/body/div/div",
      "explicitOriginalTarget": "/html/body/div/
          div".
      "rangeParent": "/html/body/div",
      "clientX": 124, "clientY": 242,
      "screenX": 1490, "screenY": 24,
      "type": "click"
      "inputStates": []
} ] ] }
```

Listing 2. Example event trace

5.2 Interpretation

After the event trace has been recorded, the process starts the first phase – interpretation (Algorithm 2). As an input, this phase receives the web application code, the recorded event trace, and the selectors for nodes chosen for extraction. From a technical perspective, we have developed a custom JavaScript interpreter based on the process by which the browser executes the web page. Besides evaluating web application code, the interpreter is capable of keeping track of information necessary to establish dependencies between different parts of the application. The interpretation algorithm has two phases: *page initialization* (lines 2–4) and *event-handling* (lines 5–7).

Algorithm 2 Interpretation

- 1: **function** INTERPRET(code, eventTrace, selectors)
- 2: astNode \leftarrow getRoot(getAST(*code*))
- 3: $hNode \leftarrow createHNode(astNode, dGraph)$
- 4: buildSubtree(*hNode*, *astNode*, *selectors*)
- 5: **for all** event in eventTrace **do**
- 6: interpretJs(getHandler(*event*), getNode(*event*), *selectors*)
- 7: end for
- 8: end function

5.2.1 Initialization phase

According to Algorithm 2, first the source code of the application is parsed and a simplified AST tree is built (encompassing code from all three languages – HTML, CSS, and JavaScript). Next, a static h-node is created for the root of the AST and added to the dependency graph (lines 2 and 3). The initialization phase is then continued in a recursive *buildSubtree* function (Algorithm 3).

Subtree building

In the subtree building phase for each encountered HTML child element, a corresponding static h-node is created (line 3). If the HTML element is a media element (image, video, etc.), an r-node is created along with the dependency from the h-node to the r-node (lines 6-8). When a CSS HTML element is reached, for each CSS rule a static c-node with a structural dependency to the containing h-node is created (lines 9-17). If a CSS rule references a resource, matching rnodes are created along with the dependencies from the c-node to the r-nodes (lines 13–16). Every time an h-node is created and inserted into the graph, current CSS rules are checked and data dependencies from the h-nodes to matching c-nodes are created (line 5). If the HTML element is none of the previously handled elements, the function is called recursively (line 21).

Alg	orithm 3 Subtree building
1:	function BUILDSUBTREE(<i>hNode</i> , <i>astNode</i> , <i>selectors</i>)
2:	<pre>for all astChld in getChildren(astNode) do</pre>
3:	$hChldNd \leftarrow createHNode(astChld)$
4:	addSDep(<i>hChldNd</i> , <i>hNode</i>)
5:	traverseCssRulesAndCreateDeps(hNode)
6:	if isMediaElement(astChld) then
7:	$rNd \leftarrow createRNd(media(astChld))$
8:	addDDep(hChldNd, rNd)
9:	else if isCssElement(astChld) then
10:	for all <i>rule</i> in astChld do
11:	$cNode \leftarrow createCNode(rule)$
12:	addSDep(<i>cNode</i> , <i>hChldNd</i>)
13:	if containsResource(<i>rule</i>) then
14:	$rNds \leftarrow createRNds(media(rule))$
15:	addDDep(cNode, rNds)
16:	end if
17:	end for
18:	else if isScriptElement(astChld) then
19:	interpretJs(<i>astChld</i> , <i>hChldNd</i> , <i>selectors</i>)
20:	else/*is any other HTML element*/
21:	<pre>buildSubtree(hChldNd, astChld, selectors)</pre>
22:	end if
23:	end for
24:	end function

Complexity. In total, the *buildSubtree* function will be executed once per HTML node. In line 9, Algorithm 3, if the HTML element contains CSS rules, the loop in line 10 is executed once per contained CSS rule. In line 19, the function invokes the *interpretJs* function, whose execution directly depends on the number of execution steps in a particular scenario. In total, the complexity of the algorithm can be approximated as: O(|h| + |c| + |s|), where *h* is the set of HTML nodes, *c* a set of CSS rules, and *s* a sequence of evaluated expressions in a scenario.

Example. Figure 5 shows the graph built while processing the code in Listing 3 according to the scenario from Section 5.1. The algorithm starts by

```
/*01*/<html>
/*02*/ <head>
/*03*/
         <stvle>
/*04*/
         .fav{background-image: url("fS.png");}
/*05*/
         .noFav{background-image: url("nS.png");}
/*06*/
         #star { width: 32px; height: 32px; }
/*07*/
        </style>
/*08*/ </head>
/*09*/ <body>
        <div class="imageRaterContainer">
/*10*/
         <img alt="Image" src="atom.png"/><br/>
/*11*/
         <div id="star" class="noFav">Note</div>
/*12*/
/*13*/
        </div>
/*14*/ <div id="notif"></div>
/*15*/<script>...
```

Listing 3. An excerpt of the page HTML and CSS code from Listing 1

creating three h-nodes: 1-html, 2-head, and 3-style node, with corresponding structural dependencies (e.g. 2*head* \rightarrow 1*-html*). Since the style node includes CSS code, the process starts creating c-nodes - three static cnodes (4-.fav, 6-.noFav, and 8-#star) are created based on three CSS rules, and each c-node has a static structural dependency towards the parent style node. Nodes 4-.fav, and 6-.noFav reference resources, so two r-nodes (5-fs.png and 7-nS.png) are created along with data-dependencies from the c-nodes to the newly created r-nodes. Next, the graph building is continued, and the process creates the h-nodes with indexes 9-11 and 13-16, as well as the necessary structural dependencies (e.g. 9-body \rightarrow 1-html); and one r-node (12-K.png). Since the creation of each h-node initiates the search for a matching CSS rule, when the 14-div node is created, data dependencies from that node to the 8-#star and 6-.noFav c-nodes are created (the HTML node matches those two CSS selectors).

Interpreting JavaScript code

When the process encounters an HTML element containing JavaScript code, it switches to the creation of jnodes (Algorithm 3, line 19), and enters the JavaScript interpretation mode, as shown in Algorithm 4. In this phase, j-nodes are created as each JavaScript expression is evaluated for the first time – the "getJNodeAddSDep" function (line 4, Algorithm 4) either returns an existing, or creates a new node along with a static structural dependency to the parent h-node. Next, depending on the position of the evaluated node in the source code, necessary control dependencies are created from the current node (lines 6–12, e.g. an expression in the body of an if statement depends on the condition of the if statement).

If the evaluated expression is handling an event, a control dependency is created towards the node which has performed the event registration (line 14). When exiting an execution context (function or program exit), control dependencies to all executed condition statements (e.g. if-conditions, loop-conditions)

Algorithm 4 Interpreting JavaScript

-	
1:	function INTERPRETJS(<i>code</i> , <i>hNode</i> , <i>selectors</i>)
2:	$programAST \leftarrow getAST(code)$
3:	while $astNd \leftarrow getNextNode(programAST)$ do
4:	$jNd \leftarrow getJNodeAddSDep(astNd, hNode)$
5:	evalRes \leftarrow evalute(astNd)
6:	if isInLoopOrBranchStatement(astNd) then
7:	addCDep(<i>iNd</i> , getCondExprNode(<i>evalRes</i>))
8:	else if isInCatchStatement(<i>astNd</i>) then
9:	addCDep(<i>iNd</i> , getErrThrowNode(<i>evalRes</i>))
10:	else if isInFunction(<i>astNd</i>) then
11:	addCDep(<i>iNd</i> , getCallExpNode(<i>evalRes</i>))
12:	end if
13:	if isHandleEvent(<i>evalRes</i>) then
14.	addCDep(iNd_getEyntRegNode(evalRes))
15:	else if isExitingContext(evalRes) then
16. 16.	addCDeps(<i>iNd</i> getCondsInCntxt() 'ExitCnt')
17·	end if
18.	if is Accessing Identifiers (eval Res) then
10. 19·	addDDen(iNd_getLastAssignNds(evalRes))
20.	end if
20. 21.	if isReading Array(Object(exalRes) then
21. 22.	addDDep(iNd_getAllModifNds(evalRes))
22.	and if
23. 24.	if is Creating Is Code (prod Res) then
24.	narce AddedCodeCreate ASTNodes(evalRes)
20. 26.	else if is Creating HtmlNodes(evalRes) then
20. 27.	$dHNds \leftarrow createDHNodes(evalues)$
27.	addDDep(dHNde iNd)
20. 29.	traverseCssRulesAndCreateDens(dHNds)
30.	else if is Creating CssNode(evalRes) then
31.	$dCNode \leftarrow createDCNode(evalUes)$
32.	addDDep(dCNode iNd)
33.	traverseCssRiilesAndCreateDeps()
34·	else if isModifyingDOM(evalRes) then
35.	$modifNids \leftarrow getModifNodes(ergalRes)$
36.	addDDep(modifNds_iNd))
37.	traverseCssRiilesAndCreateDens(modifNds)
38.	if matchSelectors(modifNds) then
39.	nush(fMants_point(iNd_lastDIndex(iNd)))
40∙	end if
40. 41·	else if isSending AjaxRequest(evalRes) then
41. 12.	addCDen(iNd_getOnnConnNode(evalRes))
42. 13.	nush(fManfe point(
43. 44.	iNd last Dinder(iNd) 'is Ajar Send'))
11. 15.	also if is A crossing A jax Response(eval Res) then
1 5. 46.	addCDen(iNd_getSndRaNode(evalRec))
40. 47.	end if
т/. 18.	labelCurrDependencies(getEvalPos(gralPos))
40. 40.	end while
±ク. 50・	end function
00.	VIIM IMIIGHUH

are also created (line 16). If the evaluated expression reads identifiers (e.g. objects, properties, and functions), then a data dependency from the current node to the node matching the last assignment of the identifier is created (line 19). Currently, we are not slicing arrays, so if the accessed object is an array, data-dependencies from the current node to all nodes that match the last assignments of each array item are also created (line 22). Also, some of the evaluated code expressions (e.g. a call to the createElement method of the document object or an assignment to the innerHTML property of an HTML element) can create dynamic nodes (lines 24–33), and in that case

```
/*15*/<script>
/*16*/ var star=document.getElementById("star")
/*17*/ var notif=document.getElementById("notif")
/*18*/ star.onclick = function () { ... }
Listing 4. An excerpt of the JavaScript initialization
code from Listing 1
```

a data-dependency is created from the dynamic node to the currently evaluated JavaScript node. JavaScript code often modifies the DOM of the page, so dynamic structural dependencies between the modified nodes and the currently evaluated j-node are also created (lines 35–40, Algorithm 4).

We consider that a server-side communication is a part of a feature implemented by a UI control if that communication is, in any way, dependent on HTML elements that define the UI control. Since in the interpretation phase the dependencies are not yet followed, each communication is treated as a potential feature manifestation point (line 43, Algorithm 4), but with a flag that marks it as such. Finally, all dependencies created while evaluating an expression (lines 4–47) are labeled with the current evaluation position (to differentiate between dependencies created on different function calls, loop executions, etc.).

Complexity. The number of loop iterations directly depends on the number of evaluated expressions in a scenario – one iteration for each evaluated expression. The complexity of the algorithm is O(|s|), where *s* is a sequence of evaluated expressions in a scenario.

Example. The processing of code in Listing 4 has reached line 15 and is entering the JavaScript interpretation mode - a variable declaration node 17varDecl is created. On the right-hand side there is a method call on the document object (which is a special object provided by the browser, acting as an interface to the DOM). The method invocation returns an object mapped to the HTML element with the id "star" (14-div), so a data dependency from the call expression to the h-node is created. Also, since the call expression is the initialization part of the variable declaration expression, a data dependency from the variable declaration to the call expression is created (17-varDecl \rightarrow 18-callExp). Nodes 20 – 22, along with their data dependencies are similarly created. Next, an assignment expression node (23-assExp) is created. The right-hand side creates a function expression, and the left-hand side a member expression. The member expression accesses the object referenced with the identifier "star", and has a data dependency towards the 17-varDecl variable declaration. The object whose property is being set is an HTML object, and the "onclick" property is a property used to set an eventhandler - a data dependency from the matching hnode to this assignment expression is created (14-div \rightarrow 23-assExp). Since there is no more JavaScript code for sequential execution, the process exits the interpretation mode. Also, all h-nodes have been created and the *page initialization* phase is finished.

5.2.2 Event handling

Once the whole code file has been traversed, and all contained JavaScript code executed in a sequential fashion, the process enters the event-handling phase (Algorithm 2, lines 5–7). Information about each event is read from the execution trace, and the dependency from the j-node matching the event handling function to the j-node matching the event-registering expression is created. Similarly to the initialization phase, JavaScript code is processed using Algorithm 4.

Example. In the demonstrated scenario, the only raised event was the click on the div element representing the star. The process reads the event trace and finds that the function in line 18, Listing 1, was executed as a click event-handler on an HTML element with id "star" (14-div). This creates a control dependency from the function expression construct towards the node matching the event-registering construct (24-funcExp \rightarrow 18-assExp). Next, the function body is interpreted.

/*18*/	<pre>star.onclick = function () {</pre>
/*19*/	<pre>var dec = star.className == "noFav"</pre>
?	"fav" : "noFav";
/*20*/	star.className = dec;
/*21*/	<pre>var req = new XMLHttpRequest();</pre>
/*22*/	<pre>req.open("GET", "d.php?d="+dec, false);</pre>
/*23*/	req.send();
/*24*/	notif.textContent = req.responseText;
/*25*/]	;

Listing 5. An excerpt of the event-handling JavaScript code from Listing 1

In line 19, Listing 5, a variable declaration node is created (26-varDecl). On the right-hand side there is a conditional expression, so a conditional expression node is created (27-condExpr) along with a data dependency from the variable declaration to the conditional expression node. A conditional expression causes the creation of the equality expression, which in turn causes the creation of a member expression node (star.className) with a data dependency towards the variable declaration (29-memberExp \rightarrow 17varDecl). Since, in this scenario, the condition evaluates to true, the process only creates j-nodes related to the first condition (31-StringLiteral), and since the execution of 31-StringLiteral depends on the value of 28-equalityExpression, a control dependency 31-*StringLiteral* \rightarrow 28-equalityExpr is also created.

The evaluation of the 32-assExpr causes the creation of 33-memberExp and 34-identifier, with data dependencies towards variable declarations (33-memberExp \rightarrow 17-varDecl, 34-identifier \rightarrow 26-varDecl). Since the "star" identifier (33-memberExpr) refers to an HTML element (14-div), this means that this assignment expression is, by writing to one of the properties ("class*Name"*) of an HTML element, modifying the DOM (changing the UI). The modified element matches the selector, and the current position (j-node matching the evaluated expression and the last created dependency) is added to the array of feature manifestation points (line 39, Algorithm 4). The process continues in a similar way up to the execution of line 23, Listing 5, where an HttpRequest is sent. According to Algorithm 4, line 43, the currently evaluated node, along with its last dependency, will be stored in the array of feature manifestation points as a potential feature manifestation point.

5.3 Graph Marking

So far, in the interpretation phase, we have identified points in the execution where the feature is manifested, but to identify all responsible code, we have to track all direct and indirect dependencies of those feature manifestation points – this part of the process is handled by the graph marking phase.

Alg	gorithm 5 Graph Marking
1:	function GRAPHMARKING(selectors)
2:	$exitContextPoints \leftarrow empty array$
3:	for all <i>fManf</i> in <i>fManfs</i> do
4:	$mNd \leftarrow \text{getNode}(fManf)$
5:	$d \leftarrow \text{getDependency}(fManf)$
6:	if isAjax(<i>bhvDep</i>) then
7:	if depsOnImprtntNd(<i>mNd</i> , <i>d</i> , selectors) then
8:	markGraph(<i>mNd</i> , <i>d</i>)
9:	end if
10:	else
11:	markGraph(<i>mNd</i> , <i>d</i>)
12:	end if
13:	end for
14:	for all hNode in dGraph do
15:	if matchesSelector(<i>hNode</i> , selectors) then
16:	for all d in getDependencies(hNode) do
17:	markGraph(<i>hNode</i> , <i>d</i>)
18:	end for
19:	end if
20:	end for
21:	tor all exitContextPoint in exitContextPoints do
22:	$dep \leftarrow getDependency(exitContextPoint)$
23:	if isIncluded(getTargetNode(dep)) then
24:	markGraph(getNode(<i>dep</i>), <i>dep</i>)
25:	end if
26:	end for
27:	end function
28:	<pre>function MARKGRAPH(node, dep, exitContextPoints)</pre>
29:	markAsIncluded(<i>node</i>)
30:	<pre>for all curDep in getPriorDepends(node, dep) do</pre>
31:	if isExitContextDep(<i>curDep</i>) then
32:	<pre>add(exitContextPoints, point(node, curDep))</pre>
33:	else
34:	markAsTraversed(<i>curDep</i>)
35:	<pre>markGraph(getTargetNode(curDep), curDep)</pre>
36:	end if
37:	end for
38:	end function

As is described in Algorithm 5, the dependency graph is traversed for all feature manifestation points

(lines 3-13), and for all h-nodes (lines 14-20) that match the input selectors. The markGraph function describes the process of traversing the graph in order to mark all code nodes that influence the feature manifestation points. The key point in the algorithm is the selection of the dependencies that will be followed (getPriorDepends function). In the interpretation phase, all dependencies have been labeled with evaluation position ids, and the getPriorDepends selects all previous non-traversed dependencies according to the evaluation position. Notice that any encountered 'ExitContext' dependencies are stored in a separate array, and are traversed at the end of the whole process only if at least one child expression of the target's parent node is included. In order to better explain the rationale behind this decision we present the code in Listing 6.

```
/*01*/var a = {
/*02*/ b:4,
/*03*/ calcSum: function() {
/*04*/
          this.num = 0;
          if(this.b) { this.num += this.b; }
/*05*/
/*06*/ }
/*07*/};
/*08*/a.calcSum();
/*09*/al = a.num;
/*10*/a.b = null;
/*11*/a.calcSum();
/*12*/a2 = a.num;
Listing 6. Example for merging results for multiple
traversals
```

For code shown in Listing 6, the values of variables a1 and a2 are 4 and 0 respectively. If we run the identification processes separately, the results would be that the necessary code expressions for a1 are contained in lines 1–9, and for a2 in lines 1, 3, 4, 11–12. By executing only the necessary lines, the values of *a*1 and *a*² would still be 4 and 0. If we wanted to identify the code that affects both a1 and a2, the straight forward way would be to join the code expressions responsible for the value of a1 and a2 (the result is the whole code except for *assExpr*@10). However, this is not correct – in that case, the value of a2 would be 4 instead of 0 (the value of b property of object a, even thought it does not directly contribute to the value of a2, influences the control-flow of the calcSum function called from *callExp*@11). For this reason, on each context exit (exiting functions or programs) we create dependencies between the calling construct and every condition that was executed in that context (line 16, Algorithm 4: there exist 'ExitContext' control dependencies *callExpr*@ $8 \rightarrow ifCond$ @5, and *callExpr*@11 \rightarrow *ifCond*@5). Now, by repeating the identification process, for a1 we again get expressions in lines 1–9, but for *a*2 we get expressions in lines 1–5 and 10–12, and joining these expressions gives the correct result. However, notice that if we are only interested in *a*2 we would end up with more code than is actually needed

(expressions in lines 2, 5, and 10 are not necessary for the standalone value of *a*2). Because of this, as the marking algorithm is executed, all *'ExitContext'* dependencies are stored and traversed at the end of the whole process only if another graph traversal has already included the condition statement (lines 23–25, Algorithm 5).

Complexity. Let $G = \langle n, e \rangle$ be a dependency graph built in the interpretation phase; where n is a set of nodes and e a set of edges; and let s be a sequence of evaluated expressions in a scenario. The execution of the algorithm depends on the three for loops. For the first loop, the length of *fManfs* is upper bound by |s| – there can not be more feature manifestations than evaluated expressions; and every execution of the *depsOnImprtntNd* function can at most go through the whole graph (every edge can be traversed at most once) – the number of executions is upper bound by |e|. The second loop is executed for each HTML node in every specified UI control, so the number of iterations is upper bound by |n|. The third loop is executed for each exitContextPoint, and since exit-ContextPoints are created on each context exit, their number is always bound by |s|. The markGraph function, which is called in each loop, can at most (across all invocations) visit all edges of the graph – has an upper bound of |e|. So the upper bound of the graph marking algorithm is: $O(|s||e|^2 + |n||e|)$. However, it is important to note that, in a typical case, the number of feature manifestation and exitContextPoints is, even though upper bound by |s|, much less than |s|.

Example. For the example in Listing 1, two feature manifestation points were identified: one for the execution of 32-assExpr that modifies the part of the UI, and one for 44-callExpr, labeled as an ajax behavior point. First, the 32-assExpr is marked as important, and its dependencies traversed: the 33-memberExpr with a dependency to 17-varDecl is also marked as important, along with the node matching the initialization call expression (*document.getElementById('star'*) - 18-callExpr) where the current value of the identifier was set. Since the call expression is dependent on the 14-div, it is also marked as important. This also causes the marking of h-nodes: 10-div, 9-body, 1-body due to structural dependencies, c-nodes: 6-.noFav, 8-#star (which causes the marking of 3-style and 2-head), and r-nodes: 5-fS.png, 7-ns.png. Since 14-div is also dependent on 23-assExpr@ all of its dependencies are also included. Similarly, for the node matching the right-hand side of the assignment expression in line 20 (34-identifier), all dependencies are also traversed and marked.

Next, the second feature manifestation point is processed. Since it is an '*AjaxSend*' feature manifestation point, first its dependencies are followed in order to determine if it is in any way dependent on any important part of the UI. Since it is indirectly dependent on 14-div, the graph is traversed, and all expressions

```
/*01*/<html>
/*02*/ <head>
/*03*/
         <stvle>
/*04*/
         .fav{background-image: url("fS.png");}
/*05*/
         .noFav{background-image: url("nS.png");}
/*06*/
         #star { width: 32px; height: 32px; }
/*07*/
        </style>
/*08*/ </head>
/*09*/ <body>
/*10*/
        <div class="imageRaterContainer">
/*11*/
         <img alt="Image" src="atom.png"/><br/>
         <div id="star" class="noFav">Note</div>
/*12*/
/*13*/
        </div>
/*14*/
/*15*/<script>
/*16*/ var star=document.getElementById("star");
/*17*/
/*18*/ star.onclick = function () {
/*19*/
        var dec = star.className == "noFav"
        ? "fav" : null;
         star.className = dec;
/*20*/
         var req = new XMLHttpRequest();
/*21*/
/*22*/
         req.open("GET", "d.php?d="+dec, false);
/*23*/
         req.send();
/*24*/
/*25*/};
/*26*/</script>
/*27*/</body>
/*28*/</html>
```

Listing 7. Example application extracted code

in lines 21–23 are marked as included. The algorithm then goes through all h-nodes that define the selected UI controls and traverses their dependencies. In this example, this does not include any more expressions, since everything important was already included in previous traversals.

With this, the process has identified all code expressions responsible for the implementation details of a feature demonstrated by the scenario. In essence, the process has identified that the first behavior (selecting the image as favorite) is mapped to the execution of the assignment expression in line 20, and the second behavior (sending the decision to the server) is mapped to the call expression in line 23. By traversing the dependencies of those two expressions, the process identifies code responsible for the whole feature. By generating code from the nodes marked as important, we get the code shown in Listing 7.

Compared to the code from Listing 1, the identification process has identified the HTML element defined in line 14, the variable declaration in line 17, and the assignment expression in line 24 as code that is not necessary for the target feature. Notice how the second expression in the conditional expression in line 19 ("noFav") is replaced by null, simply because it was not executed in the demonstrated scenario. In order to remedy this, the developer would have to change the scenario by demonstrating another click on the star element (executing the second expression).

6 TOOL SUPPORT

The whole process is currently supported by the Firecrow tool⁴, which is an extension for the Firebug⁵ web debugger. Apart from implementing the algorithms described in this paper, the tool also supports code extraction, simple reuse, and page optimization. Currently, the tool can be used from the Firefox web browser, but it can be ported to any browser that provides communication with a JavaScript debugger. Only the event trace recording is browser dependent; dependency graph construction and feature code identification are functionalities that are provided by a custom-made JavaScript library that can be used from any browser on any operating system. Figure 6 shows the UI of the Firecrow tool.



Fig. 6. Firecrow tool UI – Mark 1 shows the analyzed page, Mark 2 – the panel for selecting UI controls, and Mark 3 – Firecrow configuration window

7 EVALUATION

We have performed the evaluation with two goals: *i*) to show that the process is able to identify code that implements a feature which manifests when a user demonstrates a scenario; and *ii*) to establish the gains that can be achieved by using our method when compared to a baseline obtained by profiling code. After extracting the identified code into a standalone web application, we consider the identification process successful if we observe the same functional and visual results when executing a scenario in that stand-alone web application as we do in the context of the original application. In order to establish the gains that can be achieved with our method, we compare the lines of code (LOC) and the number of execution steps (EXE) of the extracted code (E-LOC, E-EXE) with the profiled code (P-LOC, P-EXE) which serves as a baseline. Profiling is a straightforward extraction approach – the idea is to keep all lines executed in a scenario, while maintaining syntactical correctness.

^{4.} https://github.com/jomaras/Firecrow

^{5.} http://getfirebug.com

The code extracted in this way is still capable of replicating the scenario. The difference in LOC represents code size gains, while the difference in EXEs represents performance gains – the same behavior is realized with fewer execution steps (program counter increments).

We have performed three sets of experiments: *i*) extracting client-side features, *ii*) extracting library functionalities, and *iii*) page optimization. In all cases, scenarios are defined as tests, and we consider the process successful if the tests can be successfully executed both in the original application, and in the new application composed out of the extracted code.

In addition to the metrics based on LOC and EXEs, we also present the analysis time (the time it takes to interpret the application, build the dependency graph, and generate the extracted code⁶). In the page-optimization subsection, we also include page loading-time (LT) and extracted page loading-time (E-LT), which show the gains in the page loading time when removing code that was not necessary from the application's point of view.

The data presented in this evaluation was gathered by a tool developed as a Firefox extension – all tracing data are Firefox-specific, and results could be different in another browser. All applications, and the tests describing the scenarios can be downloaded from www.fesb.hr/~jomaras/download/FIdEvaluation.zip.

7.1 Extracting Features

In the first experiment, extracting features, our goal was to show that the process is capable of extracting features that are implemented with HTML, CSS, and JavaScript code, features that manifest with UI modifications of UI controls. For each test application, we have manually identified its features, the implementing UI controls of those features, and have specified the scenarios that capture the feature behavior. Each scenario is represented as a Selenium⁷ test. Selenium IDE is a plugin for the Firefox browser which enables automated testing of web applications. A user records a series of actions, and defines UI properties that have to be satisfied in order for the test to be successful. We consider that a feature is successfully extracted if the same Selenium tests can be successfully executed both in the original application and in the application composed out of the extracted code.

The result of the process is a web page that contains only the implementing UI controls, with all necessary code and resources required for the implementation of a feature.

The experiment was performed on ten mediumsized web applications (each application contains around 11000 lines of HTML, CSS and JavaScript

7. http://docs.seleniumhq.org/

code). All evaluated applications use the jQuery library, the most wide-spread library for client-side scripting. jQuery is a complex library, with about 9,000 LOC, and provides functionality for simplifying work with multiple browsers, selecting DOM elements, animations, etc.

The results of the experiment are shown in Table 1 – out of 10 web applications, we were able to identify and extract 13 features. The table shows that, on average, the extracted feature requires only around 50% of executed code (E/P LOC), and that the same feature behavior can be achieved with 38% fewer executions (E/P EXE).

7.2 Extracting Library Functionalities

For the second experiment we wanted to validate the correctness of the extraction process against a set of externally defined behaviors. For this purpose we decided to use unit-tests specified by the developers themselves. While it is true that there does not have to be a one-to-one mapping between features and unit-tests, and that the purpose of the tests is to reveal errors and not necessarily specify features, in this experiment we consider unit-tests as externally defined behavior specification that we use to gain information about whether the extraction process is correct. We performed the experiment on three opensource JavaScript libraries: Gauss⁸ – a library for statistics, analytics, and sets; Medialize⁹ - a library for working with URLs, and Sylvester¹⁰ - a vector and matrix library.

```
/* Start Code Excerpt */
'Minimum': {
   topic: set.min(),
    '1': function(topic) {
      assert.equal(topic, 1);
   }
   /* End Code Excerpt */
/* Converted to: */
var al = set.min() == 1; //feature manifestation
```

Listing 8. Converting unit-tests in the Gauss library

Since the goal of the evaluation is to extract code responsible for each functionality represented by a unit-test, and to obtain results that show the efficiency of the extraction process, we did not want to include any non-library code. For this reason, in each unit-test, all code expressions related to unit-test libraries were replaced by functionally equivalent expressions which were then used as a basis for the feature identification process. For the example given in Listing 8, the unittest *'Minimum'* is designed to test whether the variable

8. https://github.com/stackd/gauss

^{6.} Tests run on Intel Core i7@1.73 GHz, 4 GB RAM

^{9.} https://github.com/medialize/URI.js

^{10.} https://github.com/jcoglan/sylvester

TABLE 1

Experimental results for feature extraction. F-ID – Feature ID, T – Total, P – Profiled, E – Extracted, LOC – Lines of Code, EXE – Executions, Time – Extraction time in seconds

Page	F-ID	Scenario	descriptio	on						
mailboxing.com	1	Wait for	Wait for automatic screen-shot cycling; Click each point-button once							
mailboxing.com	2	Wait for	Wait for automatic change of comment title and content							
mailboxing.com	3	Click lef	lick left arrow three times, click right arrow three times; Click each point-button							
makalumedia.com/aerospace	4	Click the	Lick the more button 10 times							
makalumedia.com/aerospace	5	From let	From left to right click each circle-button once; Click first circle button							
disposable.hipstamatic.com	6	From to	From top to bottom click each list-item once; Click first list-item							
sipp.cc	7	Hover a	nd click o	n iPhone o	container;	Click righ	t arrow twice	e; Click left a	rrow twice	
blip.me/broadcast	8	Wait for	automatio	c cycling b	etween di	fferent ite	ms			
idt.mdh.se/pride	9	Click se	cond bulle	et; Click fii	st bullet					
instagalleryapp.com	10	Click ea	ch thumbi	nail once						
fourandthree.com	11	Click ea	ch tab but	ton once						
irisapp.cc	12	Wait for	automatio	c cycling b	etween be	etween slid	des; Click eac	h slide-link o	once	
indubitablee.com	13	Wait for	automatio	c page cyc	ling; Click	each but	ton; Click rig	ht arrow, left	arrow	
Page	F-ID	T-LOC	P-LOC	E-LOC	P-EXE	E-EXE	P/T LOC	E/P LOC	E/P EXE	Time
Page mailboxing.com	F-ID	T-LOC 11464	P-LOC 4221	E-LOC 1952	P-EXE 140113	E-EXE 102979	P/T LOC 36%	E/P LOC 46%	E/P EXE 73%	Time 55
Page mailboxing.com mailboxing.com	F-ID 1 2	T-LOC 11464 11464	P-LOC 4221 3626	E-LOC 1952 1933	P-EXE 140113 194325	E-EXE 102979 87510	P/T LOC 36% 31.6%	E/P LOC 46% 53.3%	E/P EXE 73% 45%	Time 55 180
Page mailboxing.com mailboxing.com mailboxing.com	F-ID 1 2 3	T-LOC 11464 11464 11464	P-LOC 4221 3626 4385	E-LOC 1952 1933 2185	P-EXE 140113 194325 181796	E-EXE 102979 87510 136277	P/T LOC 36% 31.6% 38.2%	E/P LOC 46% 53.3% 49.8%	E/P EXE 73% 45% 76%	Time 55 180 98
Page mailboxing.com mailboxing.com mailboxing.com makalumedia.com/aerospace	F-ID 1 2 3 4	T-LOC 11464 11464 11464 11171	P-LOC 4221 3626 4385 3220	E-LOC 1952 1933 2185 1211	P-EXE 140113 194325 181796 192599	E-EXE 102979 87510 136277 101255	P/T LOC 36% 31.6% 38.2% 28.2%	E/P LOC 46% 53.3% 49.8% 37.6%	E/P EXE 73% 45% 76% 52.5%	Time 55 180 98 79
Page mailboxing.com mailboxing.com makalumedia.com/aerospace makalumedia.com/aerospace	F-ID 1 2 3 4 5	T-LOC 11464 11464 11464 11171 11171	P-LOC 4221 3626 4385 3220 3156	E-LOC 1952 1933 2185 1211 1217	P-EXE 140113 194325 181796 192599 140567	E-EXE 102979 87510 136277 101255 76935	P/T LOC 36% 31.6% 38.2% 28.2% 28.2%	E/P LOC 46% 53.3% 49.8% 37.6% 38.5%	E/P EXE 73% 45% 76% 52.5% 54.7%	Time 55 180 98 79 48
Page mailboxing.com mailboxing.com makalumedia.com/aerospace makalumedia.com/aerospace disposable.hipstamatic.com	F-ID 1 2 3 4 5 6	T-LOC 11464 11464 11464 11171 11171 9914	P-LOC 4221 3626 4385 3220 3156 2334	E-LOC 1952 1933 2185 1211 1217 827	P-EXE 140113 194325 181796 192599 140567 86088	E-EXE 102979 87510 136277 101255 76935 38036	P/T LOC 36% 31.6% 38.2% 28.2% 28.2% 28.2% 23.5%	E/P LOC 46% 53.3% 49.8% 37.6% 38.5% 35.4%	E/P EXE 73% 45% 76% 52.5% 54.7% 44.1%	Time 55 180 98 79 48 29
Page mailboxing.com mailboxing.com makalumedia.com/aerospace makalumedia.com/aerospace disposable.hipstamatic.com sipp.cc	F-ID 1 2 3 4 5 6 7	T-LOC 11464 11464 11464 11171 11171 9914 10368	P-LOC 4221 3626 4385 3220 3156 2334 2911	E-LOC 1952 1933 2185 1211 1217 827 1615	P-EXE 140113 194325 181796 192599 140567 86088 107054	E-EXE 102979 87510 136277 101255 76935 38036 70892	P/T LOC 36% 31.6% 38.2% 28.2% 28.2% 28.2% 23.5% 28.%	E/P LOC 46% 53.3% 49.8% 37.6% 38.5% 35.4% 50.6%	E/P EXE 73% 45% 76% 52.5% 54.7% 44.1% 66.2%	Time 55 180 98 79 48 29 31
Page mailboxing.com mailboxing.com makalumedia.com/aerospace makalumedia.com/aerospace disposable.hipstamatic.com sipp.cc blip.me/broadcast	F-ID 1 2 3 4 5 6 7 8	T-LOC 11464 11464 11464 11171 11171 11171 9914 10368 11141	P-LOC 4221 3626 4385 3220 3156 2334 2911 2999	E-LOC 1952 1933 2185 1211 1217 827 1615 1472	P-EXE 140113 194325 181796 192599 140567 86088 107054 137596	E-EXE 102979 87510 136277 101255 76935 38036 70892 99555	P/T LOC 36% 31.6% 38.2% 28.2% 28.2% 23.5% 28.% 26.9%	E/P LOC 46% 53.3% 49.8% 37.6% 38.5% 35.4% 50.6% 73.6%	E/P EXE 73% 45% 76% 52.5% 54.7% 44.1% 66.2% 72.3%	Time 55 180 98 79 48 29 31 39
Page mailboxing.com mailboxing.com makalumedia.com/aerospace makalumedia.com/aerospace disposable.hipstamatic.com sipp.cc blip.me/broadcast idt.mdh.se/pride	F-ID 1 2 3 4 5 6 7 8 9	T-LOC 11464 11464 11464 11171 11171 11171 9914 10368 11141 10621	P-LOC 4221 3626 4385 3220 3156 2334 2911 2999 3981	E-LOC 1952 1933 2185 1211 1217 827 1615 1472 2537	P-EXE 140113 194325 181796 192599 140567 86088 107054 137596 114283	E-EXE 102979 87510 136277 101255 76935 38036 70892 99555 58479	P/T LOC 36% 31.6% 38.2% 28.2% 28.2% 23.5% 28% 26.9% 37%	E/P LOC 46% 53.3% 49.8% 37.6% 38.5% 35.4% 50.6% 73.6% 64%	E/P EXE 73% 45% 76% 52.5% 54.7% 44.1% 66.2% 72.3% 51%	Time 55 180 98 79 48 29 31 39 73
Page mailboxing.com mailboxing.com makalumedia.com/aerospace makalumedia.com/aerospace disposable.hipstamatic.com sipp.cc blip.me/broadcast idt.mdh.se/pride instagalleryapp.com	F-ID 1 2 3 4 5 6 7 8 9 10	T-LOC 11464 11464 11464 11171 11171 11171 10368 11141 10621 9609	P-LOC 4221 3626 4385 3220 3156 2334 2911 2999 3981 2687	E-LOC 1952 1933 2185 1211 1217 827 1615 1472 2537 1083	P-EXE 140113 194325 181796 192599 140567 86088 107054 137596 114283 64583	E-EXE 102979 87510 136277 101255 76935 38036 70892 99555 58479 35072	P/T LOC 36% 31.6% 38.2% 28.2% 28.2% 23.5% 26.9% 37% 27.9%	E/P LOC 46% 53.3% 49.8% 37.6% 38.5% 35.4% 50.6% 73.6% 64% 40.3%	E/P EXE 73% 45% 76% 52.5% 54.7% 44.1% 66.2% 72.3% 51% 54.3%	Time 55 180 98 79 48 29 31 39 73 19
Page mailboxing.com mailboxing.com makalumedia.com/aerospace makalumedia.com/aerospace disposable.hipstamatic.com sipp.cc blip.me/broadcast idt.mdh.se/pride instagalleryapp.com fourandthree.com	F-ID 1 2 3 4 5 6 7 8 9 10 11	T-LOC 11464 11464 11464 11171 11171 9914 10368 11141 10621 9609 9624	P-LOC 4221 3626 4385 3220 3156 2334 2911 2999 3981 2687 2434	E-LOC 1952 1933 2185 1211 1217 827 1615 1472 2537 1083 1070	P-EXE 140113 194325 181796 192599 140567 86088 107054 137596 114283 64583 34040	E-EXE 102979 87510 136277 101255 76935 38036 70892 99555 58479 35072 17200	P/T LOC 36% 31.6% 38.2% 28.2% 28.2% 23.5% 26.9% 37% 27.9% 25.2%	E/P LOC 46% 53.3% 49.8% 37.6% 38.5% 35.4% 50.6% 73.6% 64% 40.3% 43.9%	E/P EXE 73% 45% 76% 52.5% 54.7% 44.1% 66.2% 72.3% 51% 54.3% 50.5%	Time 55 180 98 79 48 29 31 39 73 19 11
Page mailboxing.com mailboxing.com makalumedia.com/aerospace makalumedia.com/aerospace disposable.hipstamatic.com sipp.cc blip.me/broadcast idt.mdh.se/pride instagalleryapp.com fourandthree.com irisapp.cc	F-ID 1 2 3 4 5 6 7 8 9 10 11 12	T-LOC 11464 11464 11464 11171 11171 9914 10368 11141 10621 9609 9624 9903	P-LOC 4221 3626 4385 3220 3156 2334 2911 2999 3981 2687 2434 3258	E-LOC 1952 1933 2185 1211 1217 827 1615 1472 2537 1083 1070 1810	P-EXE 140113 194325 181796 192599 140567 86088 107054 137596 114283 64583 34040 176179	E-EXE 102979 87510 136277 101255 76935 38036 70892 99555 58479 35072 17200 139802	P/T LOC 36% 31.6% 38.2% 28.2% 28.2% 23.5% 26.9% 37% 27.9% 25.2% 32.8%	E/P LOC 46% 53.3% 49.8% 37.6% 38.5% 35.4% 50.6% 73.6% 64% 40.3% 43.9% 55.5%	E/P EXE 73% 45% 76% 52.5% 54.7% 44.1% 66.2% 72.3% 51% 54.3% 50.5% 79.3%	Time 55 180 98 79 48 29 31 39 73 73 79 73 19 11 43

TABLE 2 The summary of the results on extracting features from three test libraries. LOC - Lines of Code, EXE -Execution steps.

	Gauss: 678 LOC, 31/33 scenarios successful					ize: 1580]	LOC, 30/30	scenarios successful
	Min	Mean	Median	Max	Min	Mean	Median	Max
T-LOC	691	693.2	693	700	1595	1617.2	1611	1656
P-LOC	126	162.7	156	218	224	443.9	434.5	625
E-LOC	27	56.1	53	91	28	206.4	205.5	340
P-EXE	155	2771	1372	8950	840	5032.1	2718	30227
E-EXE	53	1498.4	1036	5260	98	2598.9	1461	13042
Time	1	2.27	1	18	1	3.02	2	13
P/T LOC	18.2%	23.5%	22.5%	31.1%	14.0%	27.4%	27.0%	38.3%
E/P LOC	21.4%	33.7%	32.9%	46.2%	10.1%	45.7%	47.0%	64.8%
E/T LOC	3.9%	7.8%	7.7%	13.0%	1.8%	12.7%	12.8%	20.9%
E/P EXE	25.7%	63.7%	71.7%	95.2%	3.1%	54.1%	54.6%	81.8%
	Sylvest	er: 2347 L	.OC, 83/83	scenarios successful	1	All: 147/	149 scenario	os successful
	Sylvest Min	er: 2347 L Mean	OC, 83/83 Median	scenarios successful Max	Min	All: 147/ Mean	149 scenario Median	os successful Max
T-LOC	Sylvest Min 2362	er: 2347 L Mean 2370.4	OC, 83/83 Median 2370	scenarios successful Max 2386	Min 691	All: 147/ Mean 1836.5	149 scenario Median 2364	os successful Max 2386
T-LOC P-LOC	Sylvest Min 2362 501	er: 2347 L Mean 2370.4 585.8	OC, 83/83 Median 2370 563	scenarios successful Max 2386 837	Min 691 126	All: 147/ Mean 1836.5 461	149 scenario Median 2364 527.5	os successful Max 2386 837
T-LOC P-LOC E-LOC	Sylvest Min 2362 501 35	er: 2347 L Mean 2370.4 585.8 135.4	OC, 83/83 Median 2370 563 90	scenarios successful Max 2386 837 467	Min 691 126 27	All: 147/ Mean 1836.5 461 132.1	149 scenario Median 2364 527.5 87.5	os successful Max 2386 837 467
T-LOC P-LOC E-LOC P-EXE	Sylvest Min 2362 501 35 3433	er: 2347 L Mean 2370.4 585.8 135.4 6819.9	OC, 83/83 Median 2370 563 90 4796	scenarios successful Max 2386 837 467 31114	Min 691 126 27 155	All: 147/ Mean 1836.5 461 132.1 5537.4	149 scenario Median 2364 527.5 87.5 4562	55 successful Max 2386 837 467 31114
T-LOC P-LOC E-LOC P-EXE E-EXE	Sylvest Min 2362 501 35 3433 85	er: 2347 L Mean 2370.4 585.8 135.4 6819.9 3470.2	OC, 83/83 Median 2370 563 90 4796 1412	scenarios successful Max 2386 837 467 31114 26537	Min 691 126 27 155 53	All: 147/ Mean 1836.5 461 132.1 5537.4 2845.5	149 scenario Median 2364 527.5 87.5 4562 1384	55 successful Max 2386 837 467 31114 26537
T-LOC P-LOC E-LOC P-EXE E-EXE Time	Sylvest Min 2362 501 35 3433 85 3	er: 2347 L Mean 2370.4 585.8 135.4 6819.9 3470.2 7.38	OC, 83/83 Median 2370 563 90 4796 1412 5	scenarios successful Max 2386 837 467 31114 26537 98	Min 691 126 27 155 53 1	All: 147/ Mean 1836.5 461 132.1 5537.4 2845.5 5.31	149 scenario Median 2364 527.5 87.5 4562 1384 4	Dis successful Max 2386 837 467 31114 26537 98
T-LOC P-LOC P-EXE E-EXE Time P/T LOC	Sylvest Min 2362 501 35 3433 85 3 21.2%	er: 2347 L Mean 2370.4 585.8 135.4 6819.9 3470.2 7.38 24.7%	OC, 83/83 Median 2370 563 90 4796 1412 5 23.8%	scenarios successful Max 2386 837 467 31114 26537 98 35.2%	Min 691 126 27 155 53 1 14.0%	All: 147/ Mean 1836.5 461 132.1 5537.4 2845.5 5.31 25.0%	149 scenario Median 2364 527.5 87.5 4562 1384 4 23.9%	Dis successful Max 2386 837 467 31114 26537 98 38.3%
T-LOC P-LOC E-LOC P-EXE E-EXE Time P/T LOC E/P LOC	Sylvest Min 2362 501 35 3433 85 3 21.2% 7%	er: 2347 L Mean 2370.4 585.8 135.4 6819.9 3470.2 7.38 24.7% 21.7%	OC, 83/83 Median 2370 563 90 4796 1412 5 23.8% 17.1%	scenarios successful Max 2386 837 467 31114 26537 98 35.2% 55.8%	Min 691 126 27 155 53 1 14.0% 7.0%	All: 147/ Mean 1836.5 461 132.1 5537.4 2845.5 5.31 25.0% 29.4%	149 scenario Median 2364 527.5 87.5 4562 1384 4 23.9% 28.7%	Dis successful Max 2386 837 467 31114 26537 98 38.3% 64.8%
T-LOC P-LOC E-LOC P-EXE E-EXE Time P/T LOC E/P LOC E/T LOC	Sylvest Min 2362 501 35 3433 85 3 21.2% 7% 1.5%	er: 2347 L Mean 2370.4 585.8 135.4 6819.9 3470.2 7.38 24.7% 21.7% 5.7%	OC, 83/83 Median 2370 563 90 4796 1412 5 23.8% 17.1% 3.8%	scenarios successful Max 2386 837 467 31114 26537 98 35.2% 55.8% 19.6%	Min 691 126 27 155 53 1 14.0% 7.0% 1.5%	All: 147/ Mean 1836.5 461 132.1 5537.4 2845.5 5.31 25.0% 29.4% 7.7%	149 scenario Median 2364 527.5 87.5 4562 1384 4 23.9% 28.7% 6.3%	DS SUCCESSFUI Max 2386 837 467 31114 26537 98 38.3% 64.8% 20.9%

topic (whose value is set by calling the method *min* on the *set* variable) is equal to 1. A functionally similar test would be to just check whether the *set.min()* equals 1. In that way we avoid the inclusion of the unit-test framework, but still capture the essence of the test.

Table 2 shows a summary of the results; for each library it presents mean, median, min and max values for the metrics described at the beginning of the section. In total, we have used 149 unit-tests, and in all but two cases the extracted code was able to pass the unit tests again (discussed at the end of the subsection – Failing Tests).

As can be seen in the bottom right corner of Table 2, a unit-test on average executes around 25% of total library code (Profiled/Total LOC). However, some of the executed code is not necessary from the perspective of the unit-test, and by using the extraction process we get that, on average, only 29.4% (E/P LOC) of the executed code is necessary to pass the unit-test (only 7% of total library code, E/T LOC is required to pass a unit-test). In terms of overall execution steps we can see that, on average, it is possible to replicate the feature with 46% of execution steps (E/P EXE), mostly by not including initializations that do not affect the end result. It is important to note that savings are greatest for unit-tests that test simple methods, where the overall number of execution steps performed in the method is significantly smaller than the number of executions generated in the initialization phase (notice how the savings are lower in the cases where the execution spends considerably less execution time in the initialization phase - in the most complex unit-test of the Gauss library the execution savings are only around 4.8%).

We also present the time it takes to execute the whole extraction process – on average, it takes a couple of seconds to identify the implementation code (maximum of 98 seconds for the most complex test).

This experiment illustrates how libraries come with a considerable overhead, if the application uses only a small percentage of library code.

Failing Tests

Out of 149 executed tests there are two cases where the method was not able to extract code that successfully passes the unit-test. Both tests are unit-tests of the same library and fail by executing code in the same function. A simplified version of the code is given in Listing 9.

After the execution of the program the value of b1 will be an array: [2, 3], and the value of a1: 2. If the identification process is centered on the value of a1 in line 15, the result would be the inclusion of all code expressions except the initialization of the array from line 2 (a1 depends on the array from line 5). At the core of the problem is our decision not to slice arrays (slicing arrays would cause more problems with array

```
/*01*/function fun(array) {
/*02*/ var resultArray = [];
/*03*/ for(var i = 0; i < array.length; i++) {
/*04*/
          if(array[i] % 2 == 0) {
/*05*/
            resultArray = [];
/*06*/
            resultArray.push(array[i]);
/*07*/
/*08*/
          else
/*09*/
              resultArray.push(array[i]);
        }
/*10*/
/*11*/
       return resultArray;
/*12*/}
/*13*/var b1 = fun([1,2,3]);
/*14*/var a1 = b1[0];
/*15*/al;
```

Listing 9. A simplified excerpt from a failing unit-test

indexes, loops). In this case, the algorithm includes the first item ('1') of the array from line 13 (even though the value of *a1* does not depend on it) because other items from the array are required – when reexecuting the unit test in the context of extracted code, an error occurs (*resultArray* is not initialized, the first value in the array is 1, and the control goes to line 9 and adds an item to a not-initialized array). Even though this is, in these two cases, an easily detectable and fixable problem, we acknowledge the possibility that more serious errors could occur. This is not a problem of the identification process (the process has correctly identified all dependencies), but the problem associated with extracting the identified code and using it in a stand-alone fashion.

7.3 Page Optimization

For the third experiment, page optimization, the goal was to show that the process is capable of identifying code of all features offered by the application. In the experiments the process identifies and removes code that does not contribute to any behavior. In order to do this, we have to know all application behaviors. For this reason, we have chosen 8 demo web applications that describe their behavior, and 2 standard web applications where it was easy to identify all application behaviors. Similar to the feature extraction experiment, based on the application behaviors, we have defined Selenium tests, and we consider that the extraction is successful if the extracted code is able to pass the predefined tests the original application has passed.

Table 3 shows the URL's of the selected pages, the scenarios that cause the manifestation of the behaviors, and all data gathered during the experiment. In all test applications the extracted code was able to pass the Selenium tests. The table shows that the optimized page generates 38%–100% executions (savings from 0%–62%), resulting in 0%–83% gains (1 - E/P LT) in page loading time. The savings are greatest in applications that use client-side libraries, while they are almost non-existent in small demo applications

Experimental results for page optimization. T – Total, P – Profiled, E – Extracted, LOC – Lines of Code, EXE – Executions, Time – Extraction time in seconds, LT – Loading Time

	Scenario description					
codeBubble jqueryfordesigners.com/demo/coda-bubble.html Mouse over container	Mouse over container; Mouse out container, wait for effects					
fancyCheckbox webdesign.maratz.com/lab/fancy-checkboxes-and- radio buttons /dama html	Click twice each checkbox; Click each radio-button					
humanTypist github.com/kennym/jQuery.humanTypist Wait for the typing ar	Wait for the typing animation to finish					
idtPride idt.mdh.se/pride/ Click second, first but	tton, secor	nd but	ton; wai	it for effect	s	
password jamesrwhite.co.uk/testing/ password_hash/ Type a password: pa5	55w0d		<u></u>			
tinySlider sandbox.scriptiny.com/tinySlider2/ Auto-cycle all; Click I	left; Click	right;	Click ea	ich thumbr	ail	
tabs jqueryfordesigners.com/demo/tabs.ntmi Click on each tab;						
suckerFish be twixt us/iguery/suckerFish php Mouse hover over ea	ch contain	her				
ine25.com/wp-content/uploads/2011/jquerv-	cert contain	lei				
slideshow/demo/index.html	Click on each button once					
				- (-)		
Page T-LOC P-LOC E-LOC P-EXE E-EXE P/T LOC E/P LOC F	E/P EXE	LT	E-LT	E/P LT	Time	
codaBubble 9611 2838 1383 39598 19488 30% 49%	49%	204	79	39%	27	
fancyCheckbox 117 117 108 1491 1235 100% 92%	83%	36	36	100%	2.7	
humanTypist 9480 2017 605 31629 12016 21% 30%	38%	204	34	17%	23.2	
idtPride 10621 3981 2537 114283 58479 37% 64%	51%	285	165	58%	73.9	
password 149 149 149 7047 7047 100% 100%	100%	10	10	100%	104 5	
tinyslider 260 254 248 $20/04$ 20690 98% 98%	100%	27	27	100%	134.5	
tabs $9514 \ 2520 \ 1234 \ 36599 \ 19525 \ 26\% \ 49\%$	53% E10/	200	65	32%	24.9	
tourandthree 10004 0004 2070 00020 10013 0070 0070	31% 48%	247	200	81% 37%	20.0 81.9	
iSlideshow 9859 3273 1944 101472 66917 33% 59%	40 %	205	116	50%	52.08	

(where there is no dead code).

It is important to note that the goal of the evaluation was to show that the method is capable of identifying code responsible for a behavior, and not to determine how much unnecessary code is usually included in web applications. However, the results indicate that web applications contain more code than is actually needed for their behavior, and that considerable savings could be achieved by applying this extraction method.

7.4 Threats to validity

There are several issues that might occur when attempting to generalize the experiment results. One concern is whether the selected applications are representative of real-world web applications. We tried to tackle this concern by performing experiments on a wide range of applications: from JavaScript libraries which have up to 2,000 lines of code through full web pages built from around 11,000 lines of code, that make use of the most wide-spread client-side JavaScript library – jQuery. Even in this case, in order to be able to generalize the results (e.g. that web applications contain more code than is actually needed by their behavior), the experiments would have to be performed on a much larger set of web applications. We consider this as part of future work.

Another important threat to validity is whether or not our method is capable of extracting all of the code that implements a feature. Since our method is based on dynamic analysis of web application code in a particular scenario, we are aware that the quality of the scenarios is vital to the correct identification of feature code. This is why we are not claiming that our method is capable of identifying the full code of a feature, but the code of the feature manifested by the specified scenarios. However, in order to tackle this problem we have developed a method for automatic generation of feature scenarios [35] that systematically explores the event and value space of the application. The details of the method are outside the scope of this paper.

8 RELATED WORK

Our work is closely related to program slicing, defined by Weiser [5] as a method that, starting from a subset of a program's behavior, reduces that program to a minimal form which still produces that behavior. In its original form, a program is sliced statically, for all possible program inputs. Further research has led to the development of dynamic slicing [6] in which a program slice is composed of statements that influence the value of a variable occurrence for specific program inputs - only the dependencies that occur in a specific execution of a program are studied. Program slicing is usually based on some form of Dependency Graph – a graph that shows dependencies between code constructs. Depending on the area of application, it can have different forms: a Flow Graph in original Weiser's form, a Program Dependence Graph (PDG) [7] where it shows both data and control dependencies for each expression, or a System Dependence Graph (SDG) [8] which extends the PDG to support procedure calls rather than only monolithic programs. The SDG has also been later expanded in order to support object-oriented programs [16]. None of these graphs are wholly suitable for capturing dependencies in a multi-language dynamic environment that is the client-side of the web application.

In the web domain Tonella and Ricca [9] define web application slicing as a process which results in a portion of a web application which still exhibits the same behavior as the initial web application in terms of information of interest to the user. They present a technique for web application slicing in the presence of dynamic code generation by building an SDG for server-side web applications. Even though the serverside and the client-side applications are parts of the same whole, they are based on different development paradigms, and cannot be treated equally.

Our work is also related to feature location - a technique for identifying source code locations that correspond to specific functionality. One of the earliest feature location techniques is software reconnaissance [20]. As input, the technique receives two sets of scenarios: one set triggering the target feature, and the other set not triggering it. By analyzing their execution traces the technique can identify the program elements that only appear in the traces that invoke the feature. In [14], Eisenbarth and Koschke show a semi-automatic technique that reconstructs the mapping between computational units and features that are triggered by the user and exhibit an observable behavior. Their method is based on building a concept lattice, which is analyzed by the analyst. Compared to these two methods, our method takes into account the specifics of technologies used in client-side web development, and supports automatic discovery of feature manifestation points, which we then use to identify code that implements the feature in a particular scenario.

There are also approaches that facilitate the understanding of dynamic web page behavior: Script InSight [10], FireCrystal [11], FireDetective [29], and ReAjax [30]. Script InSight helps to relate the elements in the browser with the lower-level JavaScript syntax. It uses the information gathered during the script's execution to build a dynamic, context-sensitive, controlflow model that summaries tracing information. Fire-Crystal facilitates the understanding of interactive behaviors in dynamic web pages by recording interactions and logging information about DOM changes, user input events, and JavaScript executions. After the recording phase, the user can use an execution time-line to see the code that is of interest for the particular behavior. FireDetective [29] facilitates the understanding of client-server interactions in AJAX application by visualizing the execution traces, and combining client- and server-side information to link different execution traces. ReAjax [30] is a reverseengineering tool that uses dynamical analysis to infer a finite state machine of the application's GUI, where each state represents an instance of the single-page DOM, and a transition the event that causes the DOM change. While all of these approaches facilitate the understanding of dynamic web application behaviors, compared to our approach, they work on a higher level of granularity (executed functions, DOM changes) – they make no attempt to track dependencies between different code expressions. Dependency tracking, by using the client-side dependency graph, enables us to determine the code expressions that contribute to a behavior on a finer and more exact level compared to using only profiling.

In the domain of optimizing web application code there is also a Doloto tool [31]. Doloto takes as input the existing client-side code, traces application workloads, and outputs a rewritten version that performs dynamic loading of function code. The processed application initially transfers only the portion of the code necessary for its initialization, and the rest of the code is replaced by short stubs, while the actual implementation is transfered lazily in the background, at latest on-demand. Since the goal of Doloto is to optimize the download of web application code, they make no attempt to identify feature code. Doloto's and our approach can be viewed as complementary - our method can be used to remove dead code, and Doloto can be used to dynamically load only the live code.

There are also a number of works on static [33] [34], and combined static and dynamic analysis [32]. However, our goal is to identify feature code that can later be extracted in a stand-alone fashion. This requires high precision analysis that cannot be achieved with the presented analysis techniques.

This work is a continuation and extension of our previous work [15]. Compared to that paper, we have made the following extensions: *i*) we have defined a conceptual model of the client-side that we use to reason about the relationships between features, the underlying page structure, and scenarios; *ii*) throughout the process we have added support for server-side communication, by including server-side communications as potential feature manifestation points; iii) we have provided a more detailed description of the algorithms for graph construction and graph marking; iv) we have strengthened the evaluation by performing additional experiments on three open-source libraries, and have performed the feature extraction and page optimization experiments on a larger set of web applications; v) for the whole approach, on almost all levels, we have provided significantly more details that facilitate the understanding of the whole process.

9 CONCLUSION

In this work we have shown how to identify code responsible for the implementation of a certain clientside feature in web applications. We have demonstrated how, even in this highly dynamic, multiparadigm, multi-language environment, dependencies can be tracked by constructing a client-side dependency graph, and how, by using that graph, the code responsible for a certain feature can be identified. We have evaluated the approach by performing three sets of experiments on a range of web applications, and have reached two conclusions: i) the method can correctly identify stand-alone behaviors by analyzing web application event traces; and *ii*) considerable savings in terms of number of executions, page loading time, and code size can be achieved while still being able to reproduce the demonstrated behavior.

The client-side dependency graph represents all dependencies in the application and it can be utilized in a number of different applications, e.g. for code understanding, dependency analysis, or clone detection. For future work, we plan to investigate some of these options.

The client-side and the server-side application are parts of the same whole and we plan to extend the process to support the analysis of server-side code and resources.

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