

# Web Pages Classification using Concept Analysis

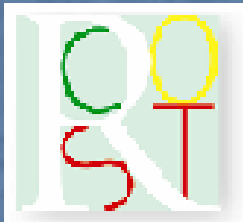
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Porfirio Tramontana

Anna Rita Fasolino

Dipartimento di Informatica e Sistemistica  
*University of Naples Federico II, Italy*



Giuseppe A. Di Lucca

RCOST – Research Centre on Software Technology  
*University of Sannio, Benevento, Italy*



# The Context

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- With the diffusion of new paradigms and technological solutions for the Web (RIA and Ajax, SOA, ...), existing Web Applications are rapidly become legacy
- A strategic objective: integrating that existing applications with the new platforms
- An open issue: defining effective approaches for analysing and classifying the Web Applications User Interface

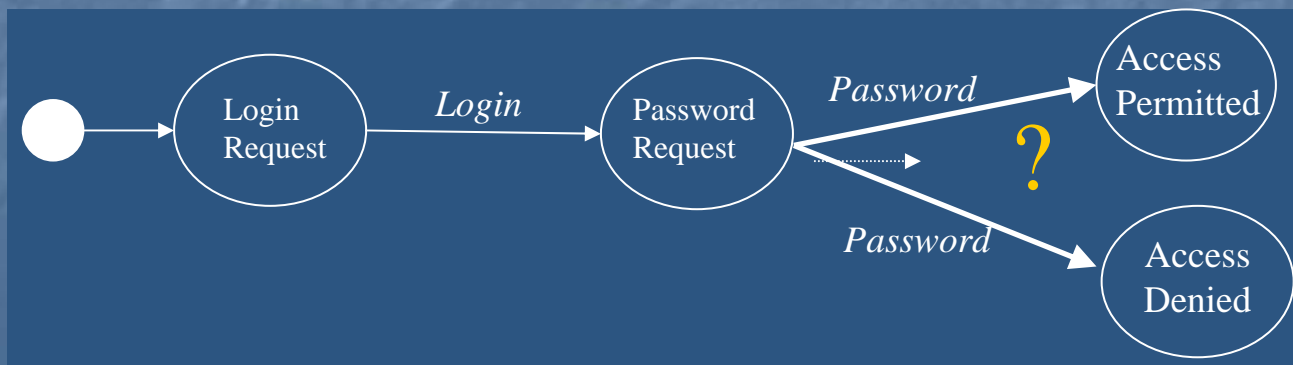
# Automatic Web Pages Classification

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- Web Applications interact with users by means of Client Pages that are dynamically generated
- Given a classification of Built Client pages in a set of equivalent classes
  - ... classes may correspond to the different reached Web Application scenarios
  - ... classes may correspond to the different results of the execution of test cases
- The problem:
  - To propose a technique for the automatic identification of the equivalence class a Web page belongs to

# A possible application scenario

- Designing wrappers that encapsulate the original UI with the aim of exporting a renewed interface, such as a Web Service one
  - The possible reached scenarios represent the classes to recognise.
  - The Wrapper has to automatically identify the class in order to know the state of the interaction with the UI and the actions to be performed



# The proposed solution

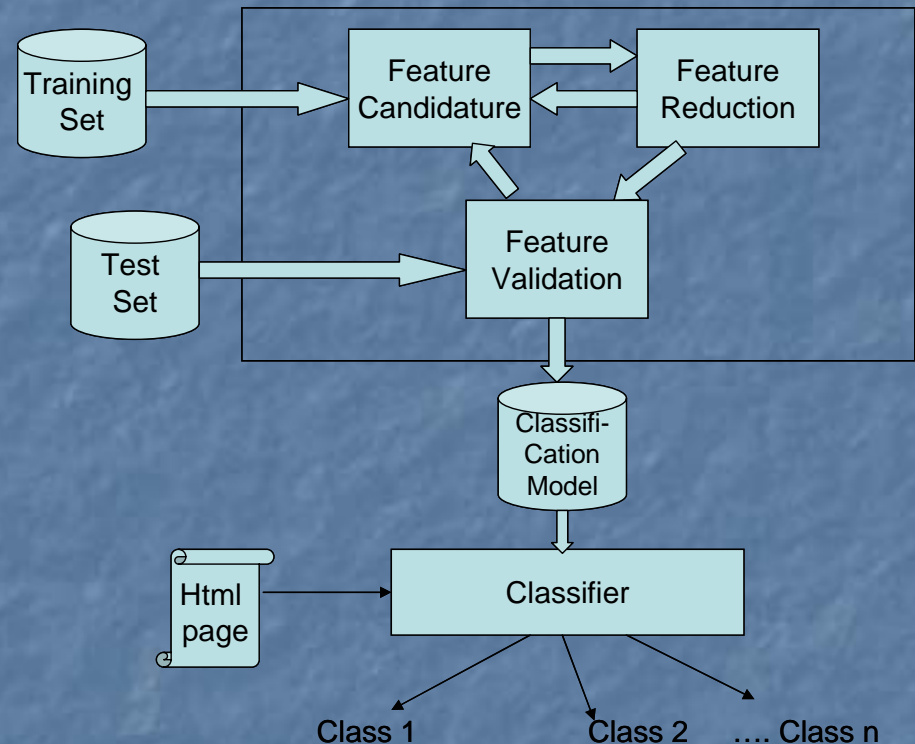
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- To find, for any class, a combination of Web page features for any class that are satisfied just by pages belonging to that class (**Classification model**)
- We are interested to a solution that is:
  - Accurate
    - The classification approach should be very reliable, in order to support automatic tasks
  - Efficient
    - The classification approach should support a fast classification of dynamic built client pages

# The proposed approach

## Three step iterative process:

1. Feature Candidature
  - Generation of a set of features, representing page characteristics
2. Feature Reduction
  - Proposition of a combination of the candidate features allowing the identification of the class of any Web page
3. Feature Validation
  - Evaluation of the accurateness of the proposed classification model (i.e. the set of discriminating expressions)



The resulting classification model allows a Classifier module to automatically determine the class any Web page belongs to

# 1 - Feature Candidature

- A **feature** is a characteristic retrievable in a Web page interface
  - It is retrievable by analysing its HTML code
    - A feature can be associated to a XPath query (if the HTML code is XHTML-compatible)
- A set of features that could be useful for discriminating a class are proposed
  - Ideally speaking, we search for features that are retrievable just in the pages belonging to a class

`//a/text() = "Activities"`

`//h1/img`

`/html/body/div[4]/form`

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## 2 - Feature Reduction

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- The goal of the Feature Reduction step is to obtain a **Discriminating Expression** for each class, i.e. a combination of features that is true for each Web page belonging to the class, false elsewhere
- The Feature Reduction is executed on the set of candidate features
  - A training set of pre-classified pages is adopted



# Evaluation Matrix

$M(i,j)$  is the value of the Feature  $j$  for the Web Page  $i$

Training Set Pages

Candidate Features

	Login	Logout	Incorrect	AdminLog...	LinkToHome
P1	X				X
P2		X		X	X
P3	X				X
P4		X			X
P5	X		X		X
P6	X		X		X
P7	X		X		X

Class C1 = {P1, P3}

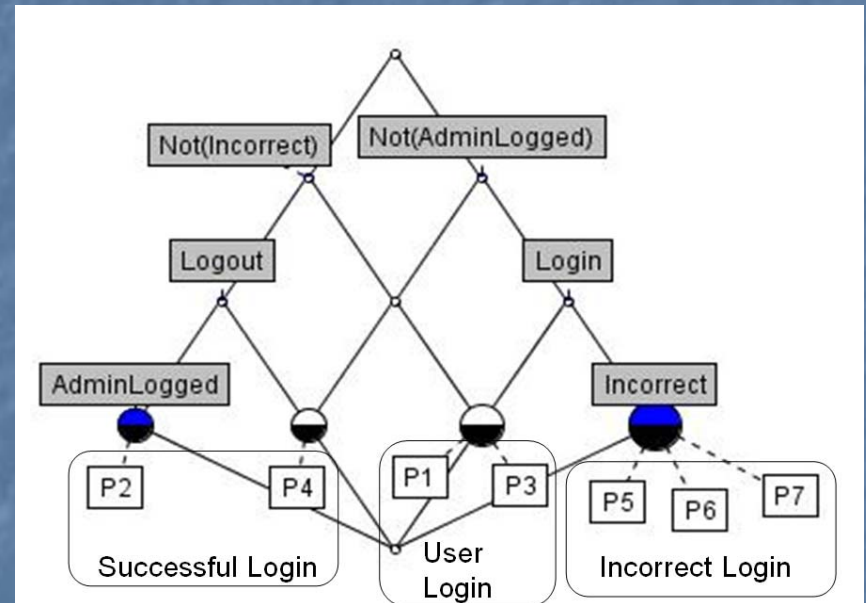
Class C2 = {P2, P4}

Class C3 = {P5, P6, P7}

The features with all true (or false) values are deleted: they surely are not useful to discriminate Classes

# Concept Analysis

- Concept Analysis is adopted to find features that characterise classes of equivalent pages
- A Concept Lattice may be automatically built on the basis of the Evaluation Matrix values (evaluated on the Training Set)



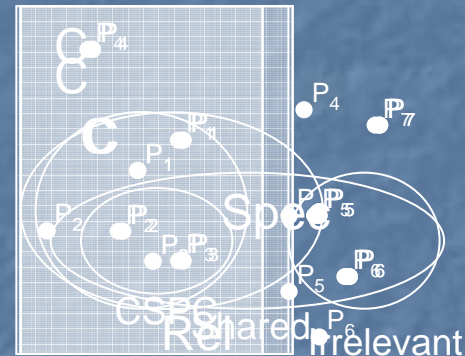
Attributes  $\equiv$  Candidate Features

Objects  $\equiv$  Training Set Pages

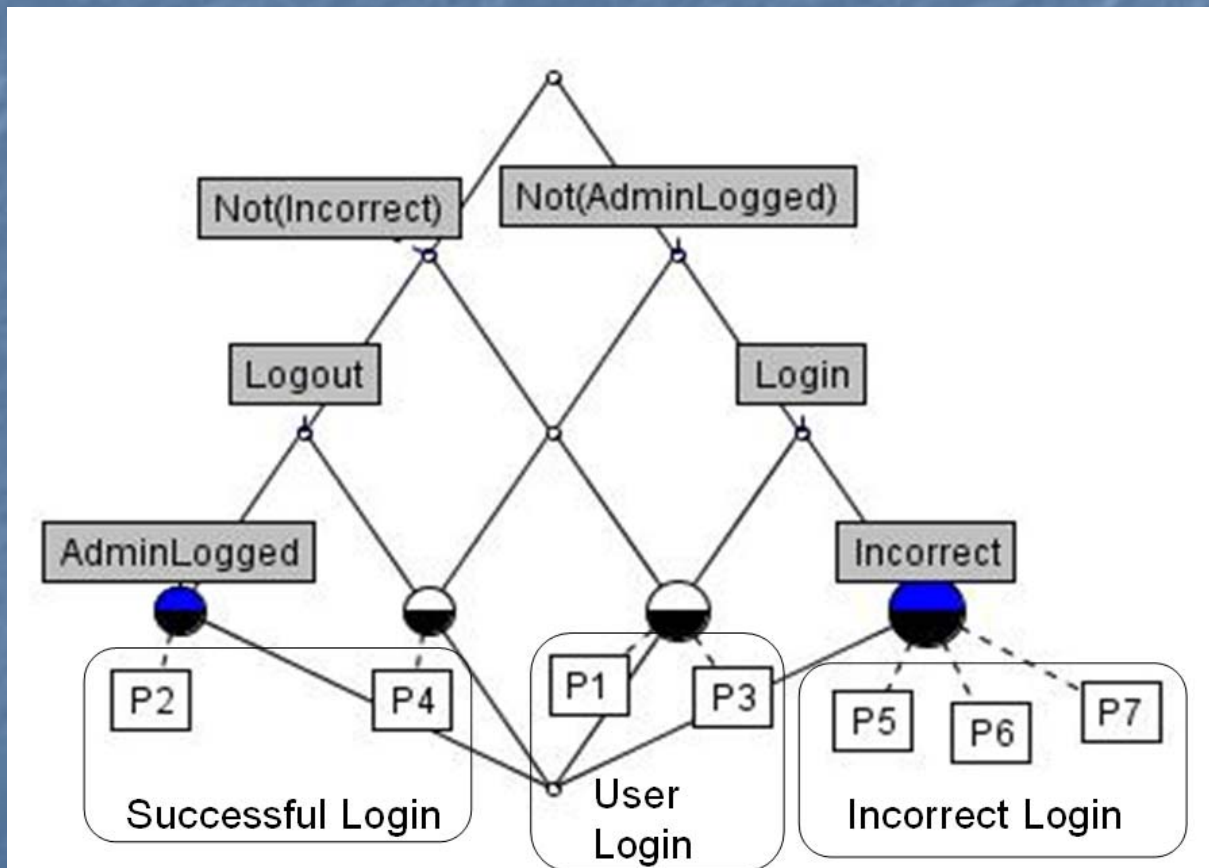
# Feature Classification

According to Eisenbarth, Koschke and Simon\*, features are classified, with respect to classes as:

- **Specific**, if it is satisfied by all and only the pages of the class C;
- **Relevant**: if it is satisfied by all the pages of the class C, but also by other pages from other classes;
- **CSPC** (i.e., Conditionally Specific): if it is satisfied by a subset of pages of the class C and by no other page from other classes;
- **Shared**: if it is satisfied by a subset of pages of the class C and by other pages from other classes too;
- **Irrelevant**: if it is not satisfied by any page of the classes C.



\* T. Eisenbarth, R. Koschke, D. Simon, "Locating features in source code", IEEE Transactions on Software Engineering, Volume 29, Issue 3, IEEE CS Press, March 2003, pp.210 – 224



For the class  
**Successful Login**

- Logout is Specific
- Not(Incorrect) is Relevant
- AdminLogged is CSPC
- Not(AdminLogged) is Shared
- Login is Irrelevant

# Feature Classification Evaluation

- The Classification of the features may be evaluated on the basis of the Concept Analysis results:

$$\textit{Specific}(C) = \bigcap_{p \in C} \textit{Intent}(OC(p)) - \bigcup_{p \in TS-C} \textit{Intent}(OC(p))$$

$$\textit{Relevant}(C) = \bigcap_{p \in C} \textit{Intent}(OC(p)) - \textit{Specific}(C)$$

$$\textit{CSPC}(C) = \bigcup_{p \in C} \textit{Intent}(OC(p)) - \bigcup_{p \in TS-C} \textit{Intent}(OC(p)) - \textit{Specific}(C)$$

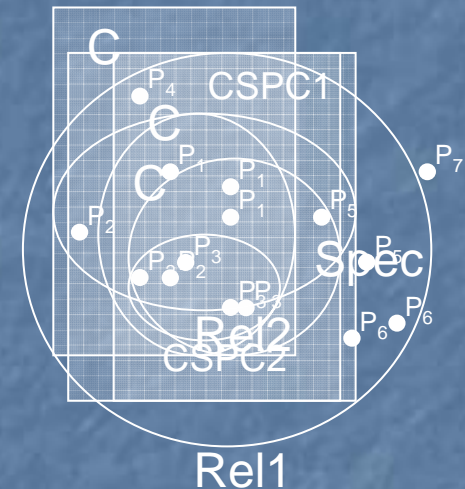
$$\textit{Shared}(C) = \bigcup_{p \in C} \textit{Intent}(OC(p)) - \textit{Specific}(C) - \textit{Relevant}(C) - \textit{CSPC}(C)$$

$$\textit{Irrelevant}(C) = F - \textit{Specific}(C) - \textit{Relevant}(C) - \textit{CSPC}(C) - \textit{Shared}(C)$$

# Rules for generating Discriminating Expressions

• Our goal is to obtain combinations of features (*Discriminating Expressions*) that are *specific* for a single class, i.e. that are true for any page belonging to the class and false elsewhere

1. If the class C includes at least one specific feature, any of these specific features can be a candidate discriminating expression of the class.
2. If there are not specific features, then a candidate discriminating expression can be obtained by considering the logic **and** of the relevant features
  - If there is a couple of features  $f_1$  and  $f_2$  so that  $f_1 \Rightarrow f_2$  (i.e.  $\text{Extent}(\text{AC}(f_1)) \subseteq \text{Extent}(\text{AC}(f_2))$ ), then it is possible to simplify the expression by discarding the feature  $f_2$  from it .
3. If there are neither specific nor relevant features, then a candidate discriminating expression can be obtained by considering the logic **or** of the CSPC features
  - If there is a couple of features  $f_1$  and  $f_2$  so that  $f_1 \Rightarrow f_2$ , it is possible to simplify the expression by discarding the feature  $f_1$  from it .



# 3 - Discriminating Expression Validation

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## ■ Recall And Precision:

$$\text{Recall} = \frac{\#(\text{pagesAttributedToClassC})}{\#(\text{AnalysedPagesBelongingToClassC})} \quad \text{Precision} = \frac{\#(\text{pagesCorrectlyAttributedToClassC})}{\#(\text{pagesAttributedToClassC})}$$

- *Failed Classification*: the page class has not been identified, because no discriminating feature (or more than one) has been satisfied by the page;
- *Incorrect Classification*: the page has been attributed to an incorrect class;
- *Correct Classification*: the page has been attributed to the correct class

# A Classification Example

- Web Pages related to the AdminBooks page of the open source Web application Bookstore has been considered
- Five classes of Web pages
- 25 Web pages training set
- 65 Web pages test set

Empty List



Single Page



Last Page



First Page


Central Page



# A Classification Example

Shopping Page

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[Home](#)
[Registration](#)
[Shopping Cart](#)
[Sign In](#)
[Administration](#)

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Category  Recommended

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**Books**

<a href="#">Edit Title</a>	<a href="#">Author</a>	<a href="#">Price</a>	<a href="#">Category</a>	<a href="#">Recommended</a>
<a href="#">Edit</a> Il gattopardo	Tomasi di Lampedusa	15	Giallo	No

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<a href="#">Edit</a> A ciascuno il suo	L. Sciascia	5	Giallo	No
<a href="#">Edit</a> Il cane di terracotta	A. Camilleri	5	Giallo	No
<a href="#">Edit</a> Nero Wolfe	Rex Stout	10	Giallo	No
<a href="#">Edit</a> Il padrino	M. puze	20	Giallo	No

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Central Page  
First Page

# Candidate features

Candidate Features -First iteration-		
Id	Description	XPath Expression
f1	Search Form (absolute)	/html/body/table[1]/tbody/tr[1]/td[1]/form[1]
f2	Search Form (relative)	//form[1]
f3	Table with Books (absolute)	/html/body/table[2]/tbody/tr[1]/td[1]/table[1]/tbody/tr[1]/td[1]/a[1]/font/text()='Books'
f4	Table with Books (relative)	//table//text()='Books'
f5	Word "Next" (absolute)	/html/body/table[2]/tbody/tr[1]/td[1]/table[1]/tbody/tr[23]/td[1]/font/a[3]/font/text()='Next'
f6	Word "Next" (relative)	//text()='Next'
f7	Word "Previous" (absolute)	/html/body/table[2]/tbody/tr[1]/td[1]/table[1]/tbody/tr[23]/td[1]/font/a[2]/font/text()='Previous'
f8	Word "Previous" (relative)	//text()='Previous'

- 8 candidate features have been considered
- f1, f2, f3, f4 have been discarded (always true)
- Negated features have been introduced

Classification of Candidate features					
	First Page	Central Page	Last Page	Single page	Empty List
<b>Specific</b>					
<b>Relevant</b>	$f_5, f_6, f_7, f_8$	$f_5, f_6, f_7, f_8$	$f_5, f_6, f_7, f_8$	$\overline{f_5}, \overline{f_6}, \overline{f_7}, \overline{f_8}$	$\overline{f_5}, \overline{f_6}, \overline{f_7}, \overline{f_8}$
<b>CSPC</b>					
<b>Shared</b>					
<b>Irrelevant</b>	$\overline{f_5}, \overline{f_6}, \overline{f_7}, \overline{f_8}$	$\overline{f_5}, \overline{f_6}, \overline{f_7}, \overline{f_8}$	$\overline{f_5}, \overline{f_6}, \overline{f_7}, \overline{f_8}$	$f_5, f_6, f_7, f_8$	$f_5, f_6, f_7, f_8$

# Discriminating Expressions – First iteration

Candidate Discriminating Expressions -First iteration-			
Class	Discriminating Expression	Recall	Precisio
First Page	$f7$	5/5	5/10
Central Page	$f7$	5/5	5/10
Last Page	$\overline{f7} \text{ AND } f8$	5/5	5/5
Single Page	$\overline{f7}$	5/5	5/10
Empty List	$\overline{f7}$	5/5	5/10

Training Set Validation

There is not enough precision!

f9	Link (absolute)	"Next"	/html/body/table[2]/tbody/tr[1]/td[1]/table[1]/tbody/tr[23]/td[1]/font/a[3][@href]/font/text()="Next"
f10	Link (relative)	"Next"	//a[@href]/text()="Next"
f11	Link (absolute)	"Previous"	/html/body/table[2]/tbody/tr[1]/td[1]/table[1]/tbody/tr[23]/td[1]/font/a[2][@href]/font/text()="Previous"
f12	Link (relative)	"Previous"	//a[@href]/text()="Previous"
f13	Text (absolute)	"No records"	/html/body/table[2]/tbody/tr[1]/td[1]/table[1]/tbody/tr[3]/td[1]/font/text()="No records"
f14	Text (relative)	"No records"	//text()="No records"

A new iteration of feature candidature is needed  
New features have been added:

1. We need to distinguish when the words "Next" and "Previous" are links or simple labels
2. We need to distinguish between empty page and single page

# Discriminating Expressions – Second Iteration

Class	Discriminating Expressions	Training Set		Test Set	
		Recall	Prec.	Recall	Prec.
First Page	$\overline{f_{12}} \text{ AND } f_7$	5/5	5/5	16/16	16/16
Central Page	$f_{11}$	5/5	5/5	11/11	11/12
Last Page	$f_{12} \text{ AND } \overline{f_7}$	5/5	5/5	14/15	14/14
Single Page	$\overline{f_{14}} \text{ AND } \overline{f_8}$	5/5	5/5	14/14	14/14
Empty List	$f_{14}$	5/5	5/5	9/9	9/9

Training Set Validation is OK but there are some problems in a page belonging to the Test Set (assigned to Central page instead of Last Page)

The incorrect-assigned page has been added to the Training Set and the Candidate Discriminating Expressions have been evaluated

Class	Discriminating Expression
First Page	$\overline{f_{12}} \text{ AND } f_7$
Central Page	$f_{11} \text{ AND } f_{10}$
Last Page	$f_{12} \text{ AND } \overline{f_{10}}$
Single Page	$\overline{f_{14}} \text{ AND } \overline{f_8}$
Empty List	$f_{14}$

Modified Expressions

Recall and Precision are, now, 100% both on the Training Set and on the Test Set

# Discussion

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- Process Effort
  - In the case study, about 100 minutes were needed to obtain the classification model
  - The activities requiring human intervention was the most critical
    - Training and Test Set Collection step
      - The reliability of the classification model depends on the *representativeness* of the Training and Test Sets
      - Web pages resulting from the execution of a Test Suite may be good candidates to fill in the Training and the Test Set
    - Feature Candidature step
      - Heuristic techniques allowing a semi-automatic generation of features are currently under experimentation

# Further application scenarios

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- Support to testing automation
  - The possible reached pages are arranged in a set of equivalence classes, corresponding to different test results
  - The proposed discriminating expressions make it possible the automatic evaluation of the testing results
- Support to dynamic analysis
  - The recognition of the reached interaction scenarios makes it possible the automatic collection of logs of the visited use cases and scenarios, providing also useful information for user profiling

# Conclusions and Future Works

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- A process for the definition of a classification model allowing the automatic identification of classes of Built Client pages has been defined and validated
- The classification model allows the run-time identification of the classification of a Built Client page, with short response time and high precision
- Future Works:
  - We are working for the process improvement, in order to reduce the effort needed to human made tasks
  - Further experimentation will be carried out in order to assess the scalability of the approach

A sunset scene with a vibrant orange and red sky. In the foreground, the silhouettes of buildings and trees are visible against the darkening light. In the background, a range of mountains is silhouetted against the bright sky. The overall mood is contemplative and dramatic.

***Time is over ... Are there any questions?***