

# ProFoUnd: Program-analysis-based Form Understanding

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## Digital Home

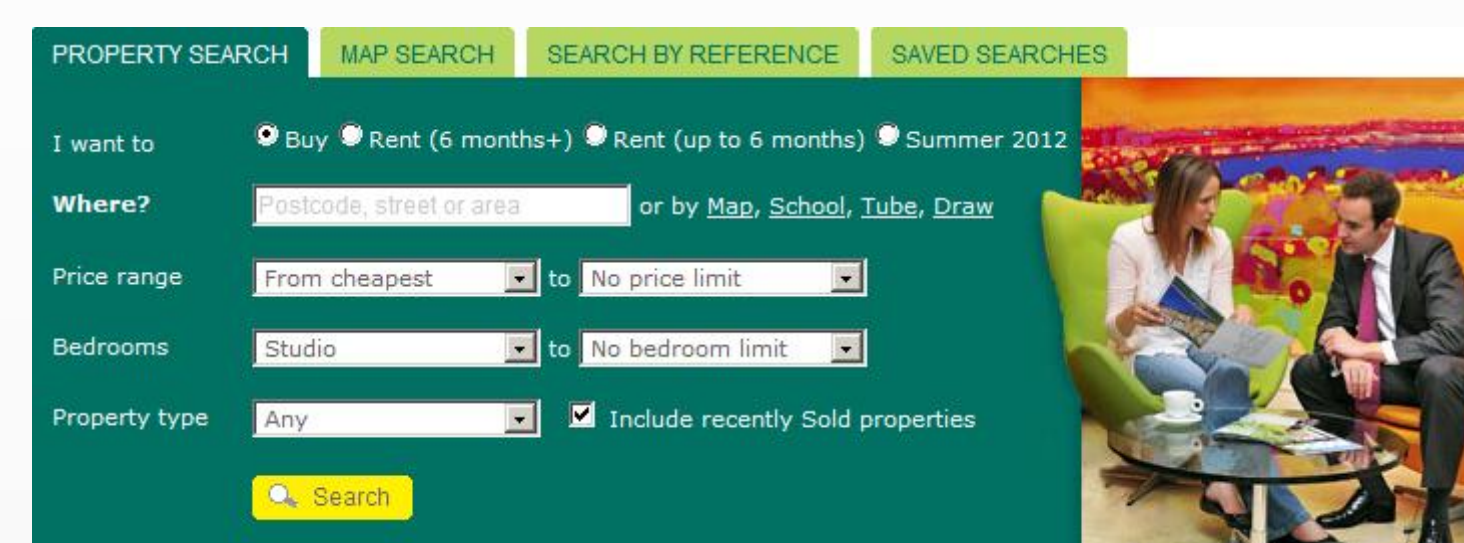
<http://diadem.cs.ox.ac.uk/profound/>

## Motivation and Contributions

### Background and Motivation

In the context of **information extraction**, in order to return all information that is relevant from a given website there are usually two necessary steps:

- Crawling the website, which is the traditional and more straightforward approach
- Tapping into the "deep" or "hidden" web via the available **search interfaces**



A typical search interface with some deep web content "hidden" behind it.

Dealing with a deep web search interface entails, roughly, the following steps:

- Find relevant website for a particular domain
- Identify a search interface (potentially leading to deep web content)
- Deduce input fields for an identified search interface and figure out corresponding meta-data with regards to labels and candidate domains of each such field
- Fill in the search form with appropriate input values and submit it (i.e. **query a hidden database**)

### Querying a hidden database

Finding constraints associated with a particular search form **prior** to querying its hidden database (i.e. before submission) would be useful in a variety of different areas:

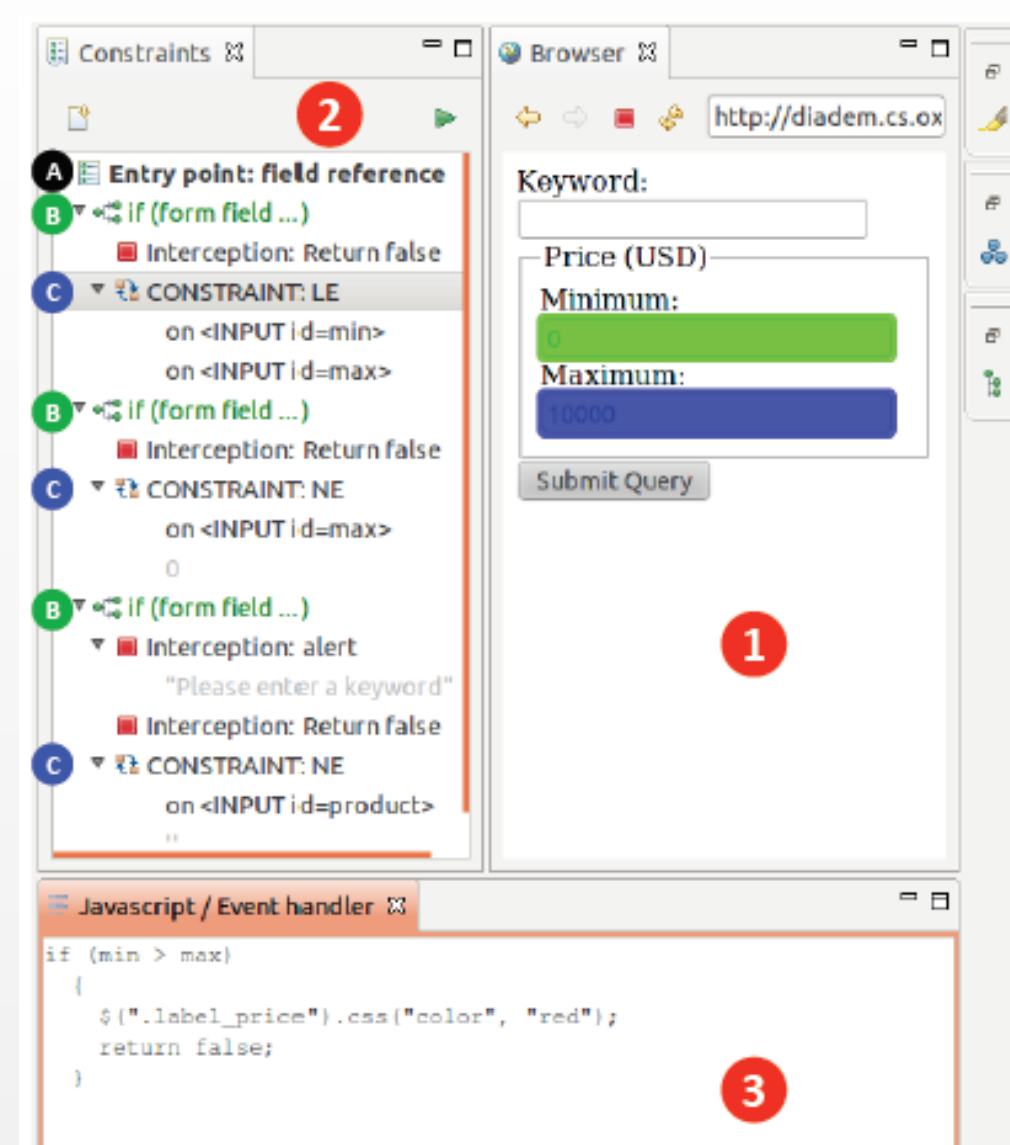
- Vertical search and information extraction
- Content surfacing
- Assistive technologies

This lead us to the following problem statement:

**Given a search interface (i.e., a web form), can we infer integrity constraints from carrying out static JavaScript analysis?**

### Contributions

- A **novel** integrity constraint identification system based on **pattern matching** and **JavaScript analysis**.
- A system able to deal with a plethora of methods available for enforcing integrity constraints on the client-side (i.e., standard and non-standard JavaScript, JavaScript libraries and web frameworks)
- A system capable of deducing **relations** (conjunctive or disjunctive) amongst integrity constraints identified.
- Thorough** experimental evaluation of ProFoUnd on a **real-world data set**, achieving integrity constraint identification with **100% accuracy** and an  $F_1$  score of over 0.77

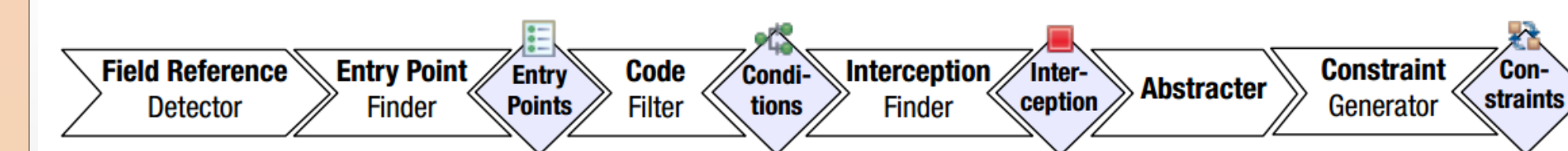


ProFoUnd is a standalone system built in the context of:



## Architecture

### ProFoUnd Architecture



We take a **two-tiered approach** of library-specific ad-hoc detectors coupled with program analysis.

### Entry Points

Assignments of JavaScript **function handlers** to a particular event for a specific DOM element. The two most common ways to do such assignments:

- Attribute-based assignment – directly attached to the HTML:

```
<form name="propertysearch" action="/search.php" onsubmit="javascript:redirectPropertySearch();" method="post" id="propertysearch">
...
</form>
```

- Script-based assignment – programmatically doing the assignment with the help of a JavaScript library:

```
$('#propertysearch').bind('submit', function (event) {
  if ($('#location').val() == "") {
    $('#locInfo').html("Please enter a location.");
    event.preventDefault();
  }
});
```

### Conditions

Numerous syntactic statements can offer **conditional behaviour**; we focus on three JavaScript-specific:

- if – else
- Ternary operators
- Return statements involving comparison operators

Variables used in conditions might be **aliased**, hence **aliasing analysis** is used prior to searching for conditional statements

### Interceptions

Clues which signal that a form may be **restrained from being submitted**, depending if a (set of) condition(s) is/are met. Two types of **interceptions** have been identified:

- Submission Interception – code that **prevents** the form from being submitted  
`event.preventDefault();`
- Interception notification – code that **notifies** a user of the interception  
`$('#locInfo').html("Please enter a location.");`

**Error message analysis** is used in order to **confirm the analysis** done up until this point or to **identify a constraint**.

From our annotated **Abstract Syntax Tree (AST)** we create a **Condition Control Flow Graph (CCFG)** in order to deduce what behaviour is yielded according to if a condition was met or not.

### Constraints

Having identified client-side validation code based on the analysis, we need to **translate conditional statements to corresponding constraints**.

Binary constraints are first identified, followed by a refinement stage to deduce **disjunctive constraints**. The end result is a disjunction of constraints  $C_i$  as follows:

$$C_0 \vee C_1 \vee \dots \vee C_{i-1} \vee C_i$$

Where each constraint  $C_i$  can be either:

- An atomic constraint  $A_i$
- A conjunction of atomic constraints  $A_0 \wedge A_1 \wedge \dots \wedge A_{i-1} \wedge A_i$

## An Example

Deep web search interface from <http://howkinsandharrison.co.uk/>

```
<form id="isc" name="isc" action="http://www.howkinsandharrison.co.uk/search.aspx" method="get" onsubmit="return PropertySearch_OnSubmit(this);">
  <div class="tableRow">...</div>
  <div class="tableRow">...</div>
  <input type="hidden" name="ept" value="9">
</form>
```

```
function PropertySearch_OnSubmit() {
  if (0 < minprice && 0 < maxprice) {
    if (!isNaN(0 < minprice.value) && !isNaN(0 < maxprice.value)) Condition
    <input type="hidden" name="price" value="9" />
    alert("Please select a maximum price higher than the minimum price selected.");
    return false;
  }
  return true;
}
```

Interception Notification & Submission Interception

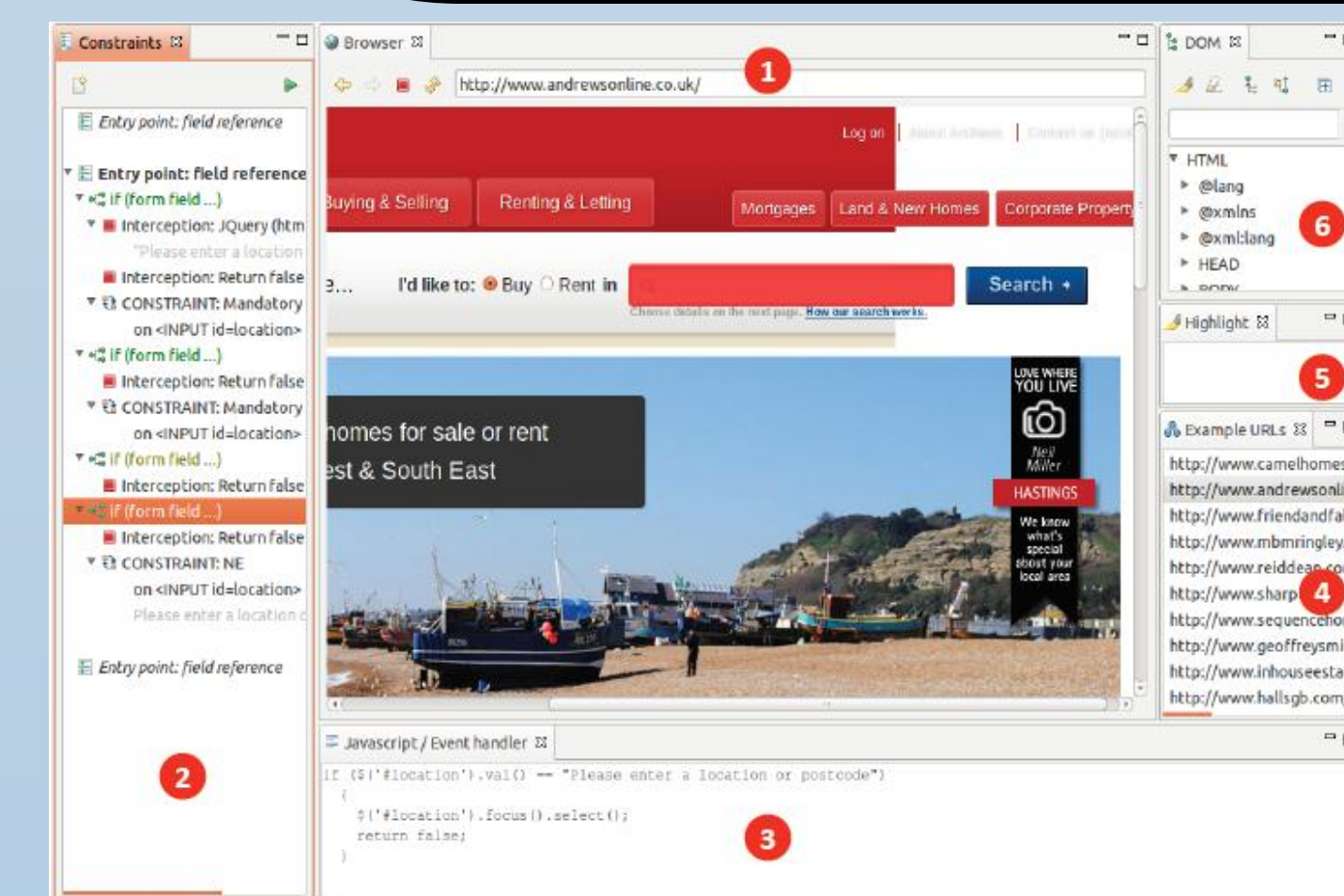
Constraint found:  $minprice < maxprice$

### Impact on Extraction

Cartesian product over all form elements would yield **5328 queries** for extracting all content hidden behind this search interface.

**Knowing the constraint identified above, 1,110 meaningless queries would be avoided; over 20% reduction in the number of queries necessary.**

## Interface



### ProFoUnd's Interface Views

- Browser view – a full-fledged **Mozilla-based browser** component
- Constraint view – shows all entry points, conditions, interception points and constraints identified by ProFoUnd
- Code view – presents relevant HTML and JavaScript fragments for the selection in the constraint view
- List of URLs
- Control over highlighted elements
- Detailed DOM access

## Experiments and Results

### Experimental Set-up

A total of **70 randomly selected real-estate websites with deep web search interfaces** from DIADEM's repository that lists all UK real estate websites made up our data set.

- From the total data set, we manually identified that **30** had validation code on the client-side, while the other **40** had no client-side validation code.
- For the 30 search interfaces **with client-side validation code**, we identified all individual integrity constraints enforced on the client-side by hand.

Our aim was to test ProFoUnd's **precision** when given interfaces with no integrity constraints, but also its **combined precision and recall** (the default balanced F measure) for interfaces with client-side validation code.

### Results

- Score of 1.0 for precision; **no false positives** identified for all 70 search interfaces
- Score of 0.628571429 for recall
- The harmonic mean was calculated as below, where P is the precision and R is the recall:

$$F_1 = \frac{2PR}{P+R} = \frac{2 \cdot 1.0 \cdot 0.628571429}{1.0 + 0.628571429} = 0.771929825$$

Our  $F_1$  score is very close to the arithmetic mean between the precision and recall indicating a **good balance**.

### Where did we struggle?

- Dealing with **obfuscated** validation code  
`$('#locInfo').html("Please enter a location.");`
- Dynamic creation of objects
- Complex JavaScript features, e.g. **eval**  
`eval("document.forms.psearch.ploc" + idx + ".checked")`
- Conditional statements within the scope of **for loops**
- Limitations of the system itself!

## Future Work

### Moving Forward

To the best of our knowledge, ProFoUnd is the **first system** to provide **integrity constraint identification** for search interfaces in the context of deep web extraction based on **JavaScript analysis**. We have demonstrated how **shallow program analysis** in this context is a viable solution for integrity constraint identification, achieving good results. However, this is just the first step – there are various **future directions** to overcome limitations and take this work a step further:

- Moving beyond pattern matching; develop a **more generic framework**, possibly supported by both supervised and unsupervised machine learning
- Combining static analysis with **runtime execution**
- JavaScript parsing; **Rhino** has a number of limitations, we aim to try **SpiderMonkey**, Mozilla's JavaScript engine
- Utilise error messages better beyond keyword-based error message analysis
- Looking at the server-side for integrity constraints

