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Web-based Human and Machine-Driven computation

Tesi di laurea specialistica



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La citazione è un utile sostituto dell'arguzia.

— Oscar Wilde

Dedicato a tutti gli appassionati di \LaTeX .

CONTENTS

1	THE BACKGROUND	1
1.1	Crowd-based computation distribution	1
1.1.1	Human computation & GWAP	1
1.1.2	Automatic computation	4
1.2	Enabling web-based distributed computation	7
1.2.1	HTML5	8
1.2.2	WebCL	10
2	THE MODEL	11
2.1	Data model	11
2.1.1	WorkFlow	12
2.1.2	Task Data Model	15
2.1.3	Task Data	16
2.1.4	Task Execution	16
2.1.5	Statistics	18
2.2	Architectural model	18
2.2.1	Configurator	19
2.2.2	Execution layer	20
2.2.3	Task storage & task runtime storage	20
2.2.4	Performer & Performer client	20
2.2.5	Planning strategies	20
2.2.6	Assignment strategies	21
2.3	Execution model	21
2.3.1	Static execution	22
2.3.2	Static μ Task planning & Dynamic assignment	22
2.3.3	Dynamic μ Task planning & Static assignment	22
2.3.4	Dynamic μ Task planning & Dynamic assignment	23
2.4	Pluggable strategies assignment	23
2.4.1	Built-in strategies model	23
2.4.2	Custom strategies	25
3	THE USE-CASES	27
3.1	Automatic	27
3.2	Human	29
3.3	Hybrid (automatic+human)	29
4	IMPLEMENTATION AND EVALUATION	31
4.1	Architecture	31
4.2	Performance comparison???	31
A	CONCLUSION AND FUTURE WORKS	33

LIST OF FIGURES

Figure 1	Web interface of <i>MTurk</i>	3
Figure 2	The ESP game.	4
Figure 3	The FoldIt client.	4
Figure 4	Data Model.	12
Figure 5	Conceptual organization of Work, Task and μ Task.	12
Figure 6	Reference architecture.	18
Figure 7	Specialized architecture.	19
Figure 8	Representation of the Task execution flow.	21
Figure 9	Interface of the automatic use-case.	27
Figure 10	Intermediate results of the algorithm.	28
Figure 11	<i>SIFT</i> result comparison with the reference data.	29
Figure 12	Interface of the hybrid use-case.	30

LIST OF TABLES

Table 1	Task distribution and execution matrix.	xii
Table 2	Task planning vs. Task Assignment.	22
Table 3	<i>SIFT</i> performace.	29

SOMMARIO

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ABSTRACT

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*Abbiamo visto che la programmazione è un'arte,
perché richiede conoscenza, applicazione, abilità e ingegno,
ma soprattutto per la bellezza degli oggetti che produce.*

— Donald Ervin Knuth

RINGRAZIAMENTI

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Como, Ottobre 2012

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INTRODUCTION

In the field of distributed computing have been used several methods to create a common layer able to execute code on different systems and platforms. The paradigm of distributed computing is based on the paradigm of grid computing and on that of cloud computing. These paradigms leverage on the core concept of creating an abstraction layer on top of the available resource in order to make them consistent, for example grid computing abstract only part of the available resources, meanwhile cloud computing abstract the whole hardware.

The distribution of the computation can be done at **hardware** or **software** level.

At **hardware** level we have similar distributed resources, or at least can be easily abstracted, so we can distribute and gather the results. This paradigm is used in frameworks like [Dean and Ghemawat, 2008](#) where the computation is spread on large cluster of computers.

The distribution of computation at **software** level uses the concept of distributed systems, where the automatic computation is spread among different machines usually separated by a network. Once the computation is executed by a node, the result is processed by the server and if needed another computation is triggered by ther server, an so on.

Another paradigm has been outlined in this field, **human computation**. The paradigm is the same as above because we need to computation but here the nodes have the ability to perform computation that other standard nodes, like pc and similar, are not able to do.

As one may notice, the idea of human computation is very similar to distributed computation also it leverage on web-based distribution technologies. Users get engaged using the web, and also the tasks are executed within a web browser. Human computation application or Game With A Purpose ([GWAP](#)) usually relies on the web as a common platform like [Von Ahn, Liu, and Blum, 2006](#) or *MTurk*. Another solution is to create a standalone normalized software platform like *FoldIt*.

Given this general overview one can spot that we reached a condition where we have the technical ability to use all the web-users as nodes able to perform arbitrarily complex computation either automatic or human.

As far as we know there are no methods or tools able to stress this opportunities, because they focus on human or automatic computation¹. The matrix in table 1 is the representation of the available online

¹ Not web-based, but using standalone clients.

tools categorized using as dimensions the will of the user of performing such tasks and the *complexity* of the algorithm. When using the term *complexity* we refer to two main types of computational complexity *workload complexity* and *algorithm complexity*.

Workload complexity indexes all that algorithms that need to perform a huge amount of simple (or not so simple) computation on a lot of data. To address this problem we need use the *Divide et impera* paradigm, like the one used in [Dean and Ghemawat, 2008](#), allowing to split algorithms that operates on huge amount of data into atomic steps that can be executed by any node. When dealing with this type of complexity we need to do **automatic** computation.

Algorithm complexity addresses the other dimension, here we consider the complexity as the computational feasibility of each step of the algorithm. As an example consider the following algorithm:

```

input : a set of tweet about a politician
output: each tweet marked as in favor or against the politician

foreach tweet in tweets do
  opinion  $\leftarrow$  check(tweet);
  if opinion  $\neq$  IN_FAVOR then
    | contactCIA();
  end
  setTweet(tweet, opinion);
end

```

Algorithm 1: Tweet validation

The algorithm itself is not complex but operation like $\text{opinion} \neq \text{IN_FAVOR}$ cannot be done by a normal node, like a pc, or they took too long to be computed. These cases belongs to the field of **human** computation.

Table 1.: Task distribution and execution matrix.

	Automatic	Human
Voluntary	BOINC	MTurk
Involuntary	Parasitic computing	GWAP

A limitation of the available frameworks for automatic computation is the ease of access of the tool for the end-users. Let's take Search for Extra-Terrestrial Intelligence *at home* ([SETI@home](#)) as an example, this tool uses the Berkeley Open Infrastructure for Network Computing ([BOINC](#)) platform to search for extraterrestrial activity using radio telescope and analyzing narrow-bandwidth radio signal. A user who want to participate to this project must install the [BOINC](#) platform and then enter a specific URL to start contributing. This steps, despite their simplicity, have hidden overhead to the user and to the [SETI@home](#) project. The installation of ad-hoc clients can be a problem when a user work on a machine with strong restriction, also the [SETI@home](#)

project must adapt their data and computation to be executed within the BOINC platform.

ORIGINAL CONTRIBUTION

The aim of this thesis is to present a model for distributing and executing task that covers all the matrix dimension expressed in table 1, and on top of that provide:

- ease of access to the tasks
- usage of standardized protocols/languages
- ease of implementation by the *requester*
- ease of execution by the users

The original contributions are:

1. Definition of a model for automatic, human and hybrid computation
2. Implementation of a reference web-based architecture for human and automatic implementation
3. Implementation of an infrastructure supporting the defined model
4. Validation through 3 use cases (*automatic*, *human*, *hybrid*)

OUTLINE

The thesis is organized in four main parts.

THE FIRST CHAPTER

NEL SECONDO CAPITOLO

NEL TERZO CAPITOLO

NELL'ULTIMO CAPITOLO

1

THE BACKGROUND

Recent years have seen an increasing interest in *Human Computation* and *Crowdsourcing* areas. One of the reason they are becoming so attractive is the growth of the Web. This has allowed to leverage the ability of people over the internet to perform tasks that even modern computers cannot achieve properly.

This chapter, first, focus on the key steps and developments in these fields that lead to the purposes of this thesis. We provide an overview of [human computation](#) and parasitic computing, then we introduce the technologies that enables the distributed computation on the web such as [HTML5](#) for the task distribution and execution and [WebCL](#) for the task execution.

1.1 CROWD-BASED COMPUTATION DISTRIBUTION

Distributing computation (task computation) in the crowd means splitting the task execution into atomic subtask that can be executed by a host (human or not).

Write something about the crowd based distribution of the tasks, use references to (Mechanical turk [Little et al., 2010](#)) if possible.

The online tool [MTurk](#) provide a framework for the creation distribution, execution and result gathering of task (called Human Intelligent Task ([HIT](#))). Diring the creation a *Requester* The *Requester* can push request for executing [HIT](#), these are

1.1.1 Human computation & [GWAP](#)

Computers are capable of performing many tasks, they can process large amounts of data and do billions of operation in a few seconds. However, there are still many problems that computers cannot solve or take too much time to solve even for the powerful pc.

Some of these are very simple tasks for humans, for example natual language processing and object regonition are hard to solve problem for a computer but natural for a human being. A great example for this kind of problem is recognizing hand-written text, even after years of research, humans are still faster and more accurate than any computer.

Furthermore, there are problems that are too computationally expensive, such as many NP-complete problems like Traveling Salesman

problem, scheduling problems, packing problems, and FPGA routing problems.

The expression *Human Computation* in the context of computer science is already used by Turing, 1950. However is Law and Ahn, 2011 to introduce the modern usage of the term. He defines human computation as *a research area of computer science that aims to build systems allowing massive collaboration between humans and computers to solve problems that could be impossible for either to solve alone*. But, in my opinion simple and direct definitions are better to get the point:

*Some problems are hard, even for the most
sophisticated AI algorithms.
Let humans solve it. . .*
— Edith Law

In practice when speaking about human computation we refer to an algorithm that involves human interaction during the computational process. As an example infrastructure one can think of *MTurk*, a *centralized* human computation platform that leverage on *Workers* to perform task.

By using the term *centralized* we mean that all the computation is performed in one central place (e.g. *MTurk* website). On the other hand we have *distributed* human computation, here the code is offloaded to the client using some ad-hoc software clients.

Centralized

The *centralized* paradigm is the most common because it do not require the creation of ad-hoc clients to perform computation, that can run directly in the browser. Now we present some of the well known online tools that use this kind of algorithm.

MTurk is an online tool that allow the execution of crowd-based human computation task, called *HIT*. Each *HIT* is created by a *Requester* whom decides also the revenue for the execution of the tasks and some other constraints to the execution (i.e. user qualification). Once the creation is completed the *HIT* is ready to be executed by a *Worker*. A *Worker* is a human being registered to the *MTurk* platform willing to perform simple task in exchange for money, the revenues can be as low as 0.01\$ per user per task. Once the whole *HIT* is completed the *Requester* check the result and if it is satisfied proceed with the payment. All these operation must be performed within the *MTurk* website so there is no need of any software installed.

This system has been *extended* as presented in Little *et al.*, 2010 to create complete algorithm able to use human computation as functions during the execution. Here is an example algorithm implemented in *Turkit*:

The screenshot shows the Amazon Mechanical Turk dashboard. At the top, there's a navigation bar with 'Your Account', 'HITS', and 'Qualifications' tabs. Below this, a search bar allows filtering by 'Find HITS' and 'that pay at least \$ 0.00'. A table lists several HITs, each with a requester link, expiration date, time allotted, reward, and number of available HITs. The HITs are for video transcription and tagging, and voicemail transcription.

Requester	HIT Expiration Date	Time Allotted	Reward	HITs Available
SpeechLink	Sep 12, 2012 (5 days)	4 days	\$81.76	1
SpeechLink	Sep 12, 2012 (5 days 2 hours)	4 days	\$76.19	1
SpeechLink	Sep 12, 2012 (5 days 2 hours)	4 days	\$46.99	1
SpeechLink	Sep 7, 2012 (11 hours 41 minutes)	4 days	\$36.00	1
SpeechLink	Sep 9, 2012 (2 days 12 hours)	4 days	\$33.31	1

Figure 1.: Web interface of *MTurk*.

```

ideas = []
for (var i = 0; i < 5; i++) {
    idea = mturk.prompt("What's fun to see in New York City?
        Ideas so far: " + ideas.join(", "))
    ideas.push(idea)
}
ideas.sort(function (a, b) {
    v = mturk.vote("Which is better?", [a, b])
    return v == a ? -1 : 1
})

```

Where `mturk.prompt` and `mturk.vote` are human computation task executed on the *MTurk* platform.

ESP is a *GWAP* developed by Luis von Ahn to perform image their task is to agree on a word that would be an appropriate label for the recognition using the power of humans as described in *Von Ahn and Dabbish, 2004*. The game rules are simple, once logged in a user will be automatically matched with a random partner. Once matched, they will both be shown the same image, their task is to agree on a word that would be an appropriate label for the image. Similar to the ESP game is Peekaboom another *GWAP* proposed by von Ahn described in *Von Ahn, Liu, and Blum, 2006*.

CROWDSEARCHER TODO ???

Distributed

This solution relies on the creation of ad-hoc clients that are able to download and run the code on all the platforms. With this solution the user do not need to go to a website to run the code remotely. The most known implementation of this paradigm is the *FoldIt* game.



Figure 2.: The ESP game.

FoldIt is a puzzle game about protein folding, developed by the University of Washington's Center for Game Science in collaboration with the UW Department of Biochemistry. The objective of the game is to fold the structure of selected proteins to the best of the player's ability. The highest scoring solutions are analysed by researchers, that can determine whether or not there is a native structural configuration that can be applied to the relevant proteins.

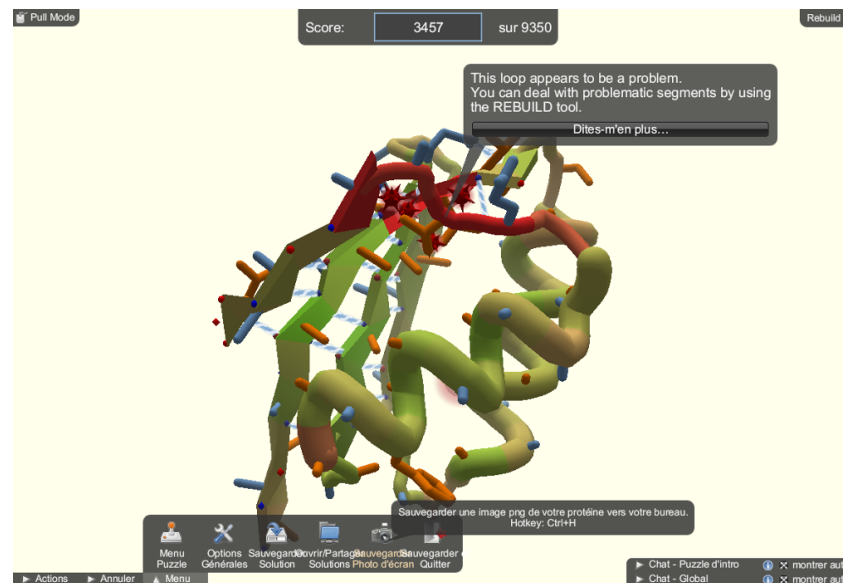


Figure 3.: The FoldIt client.

1.1.2 Automatic computation

Voluntary computing

BOIC + SETI

Parasitic computing

Parasitic computing¹ is a technique that, using some exploits and ad-hoc code, permits to execute computation on unaware host computer. This approach was first proposed by Barabási *et al.*, 2001 to solve the NP-complete 3-SAT problem using the existing TCP/IP protocol and its error handling routines.

Parasitic computing has a strong relationship with *distributed computing*, in fact it is like a specialization of the general class of *distributed computing* where the user is unaware of the execution². Given that we can list the main steps used to perform distributed computing:

- Split task into atomic operations executable by any host
- Send the code to all the host computers
- Execute the code
- Gather the results from the hosts
- Join all the hosts result and compute the task output

Distributed computing leverage on the idea of *divide and conquer* like the programming model of MapReduce³. Frameworks as BOINC and SETI@home implement distributed computing paradigm to perform large scale operations (such as signal analysis) among the volunteers that installed the clients. These volunteers choose the project they are interested in and give the idle time of their machines to perform the computation.

Parasitic computing performs the same kind of task in the same *distributed* fashion but the main difference is that the users are unaware of the computation that is being executed on their pc.

- **Parlare di quante volte effettuiamo computazione parassitica senza sperlo.**
Esempi?
- **Parasitic computing può anche essere fatto in un modo conscio.**
Notificando all'utente la possibilità di eseguire del codice (senza sapere quale) in cambio di un ritorno di qualche tipo (Karame, Francillon, and Čapkun, 2011).
- Using the same model of unaware host we can perform high level computation using JavaScript.*Modernizr*

The main drawback of distributed computing is the portability and distribution. The installation of some kind of client to execute the code can be seen as a problem for some user, as an example some users

¹ In this thesis we are not covering, neither we are interested, in the ethical or moral implication of using such programming model.

² In *distributed computing* the user can be unaware of the purpose computation is for or what actual code they are executing, but they are aware of the execution.

³ Dean and Ghemawat, 2008.

simply cannot install software on their workstation, due to security restriction or missing disk space. The other problem is distribution, the main purpose of these frameworks is to perform massive parallel computation, but for the computation to be really massive we need a lot of volunteers that installed the client on their pc and are online to execute the code.

Grafico con insiemi per distributed computing and parasitic computing?

PARASITIC JAVASCRIPT can lead to a solution of these problems using a widespread and standard technologies. Using the Web as the distribution platform the audience can scale rapidly from thousands to hundred thousands of users. Regarding the need of third part software installation and security issues, using JavaScript these problems are avoided, because all the code the browsers runs is executed into a sandboxed execution environment so it cannot harm the users pc. The same stands for the portability of the code, because almost all browsers⁴ support JavaScript with all the HTML5 features (see 1.2.1), so the porting of the code is guaranteed on every system that can run a browser.

Let make an example CREARE ESEMPIO CON BOINC E UN SITO DA 500.000 VISITE

Using parasitic JavaScript can lead to some **hybrid** solution between distributed and parasitic computing. Using the browser we can ask to user if it is willing to run some code⁵ then we can proceed downloading all the required resource to run the code. This approach make possible to have a proactive approach to volunteer computing, so there is no more the need of waiting until the users are willing to spend some time running a task.

This **hybrid** approach is proposed in Karame, Francillon, and Čapkun, 2011 as long as a μ Payment model for task execution.

- problema del distributed computing (installazione del client | distribuzione)
- FATTO
- soluzione: piattaforma standard condivisa da tutti Javascript - FATTO
- problema HTML4 -> HTML5 collegamento - FATTO
- permette una soluzione idriba (avviso che può essere eseguita della computazione, l'utente sceglie) - FATTO

⁴ ****COUGH**** IE ****COUGH****

⁵ mettere una nota in cui si parla del revenue dell'utente e alla sezione in cui viene discusso meglio il tutto

1.2 ENABLING WEB-BASED DISTRIBUTED COMPUTATION

Web-based computation implies that a client is able to perform almost any kind of task that usually is done by an application software, as an example think about image analysis, audio/video playback or socket connection; these operations are available to developers without the need of additional libraries or external *plugins*.

When building Rich Internet Application ([RIA](#)) developers have to face the problem of building *rich* web application without the required tools for **communication**, **data access** and **data storage**. Access to raw data of images or audio, API for file management, data storage and full-duplex communication are all problems that could not be solved without using plugins like Flash or Silverlight.

The advent of HTML5 has brought a breath of fresh air to the Web. HTML5 specifies all these features as part of the language specifications so they are being implemented in all major javascript engines (Presto, V8, SquirrelFish, JägerMonkey). This means that almost all the required tools to build real *rich* internet application are built-in in the JavaScript language.

COMMUNICATION is being empowered by the introduction of *WebSocket* that enable full-duplex data exchange with the server. Also the introduction of Cross-origin Resource Sharing ([CORS](#)) give the developers the possibility to contact foreign servers using Asynchronous JavaScript and XML ([AJAX](#)) without the need of a proxy for forwarding the requests.

DATA ACCESS is obtained using HTML5 media elements (`<video>` and `<audio>`) or the File API.

DATA STORAGE is available through the `localStorage` and `sessionStorage` global variables or using IndexedDB or even a built-in WebSQL database.

With the introduction of all these features developers can use the power of JavaScript to perform image analysis, audio/video playback (without any external plugin installed), create 2D/3D games and so on.

These features make possible to create tools like *Emscripten* that is a LLVM-to-JavaScript compiler. Basically allow developers to convert their C/C++ code into standard JavaScript, obviously the performance are not comparable but different level of code optimization lead to good performance gains in terms of code size and execution speed.

Additionally specification like [CORS](#), not strictly related to JavaScript, allow the users to make cross-site request, that was a great limitation in JavaScript development.

1.2.1 HTML5

In this thesis when i refer to HTML5 i'm not speaking only about the HTML5 tag reference. I am speaking about a set of thechnologies and specifications related to HTML5. It includes the HyperText Markup Language version 5 ([HTML5](#)) specification itself, the Cascading Style Sheets ([CSS3](#)) recomendations and a whole new set of JavaScript APIs. So, first things first, lets make some clarification:

HTML5 refers to a new set of semantic tag (like `<footer>`, `<header>`, `<article>`, ...), media tags (like `<video>` or `<audio>`) and the so called Web Form 2.0.

css3 refers to the presentation layer specification including image effects, 3D transformation, tag selectors and form element validation.

JS refers to the new set of API provided, that enable interaction with all these new elements, and additional, non tag-related, functionalities (like WebSockets or WebWorkers).

With the advent of [HTML5](#), like any new web-technology, many problems were resolved and many others have been created. The main issue with using HTML5 is the browser compatibility and browser-specific methods. Every borowser has its own implementation of the HTML5, this is mainly due to the early implementation of draft specification⁶.

To avoid browser inconsistency we could use JavaScript frameworks. Frameworks like *jQuery* provide a layer of abstraction between browser-specific code and the user, giving developers JavaScript fallbacks for the most common API and additional features not covered by the standard implementation. Other tools like *Modernizr* give developers the ability to test if some HTML5 features are supported or not and provide a general fallback system for dynamically loading polyfills⁷.

Now i will analyze in detail the main features of HTML5 to better understand their usefullness.

CANVAS Let's start with the official definition⁸

The canvas element provides scripts with a resolution-dependent bitmap canvas, which can be used for rendering graphs, game graphics, or other visual images on the fly.

So basically is a *Canvas*, like the name says, but give the developer the access to the raw pixel data of the canvas contents. Also in the canvas element you can draw the image taken from an `` tag or

⁶ In fact HTML5 (at the time of writing) is not yet standardized, is still a draft. See <http://www.w3.org/TR/html5/>

⁷ A polyfill is a JavaScript library or third part plugin that emulates one or more HTML5 features, providing websites to have the same *look and feel* also on older browser.

⁸ Got from the specs: <http://www.w3.org/TR/html5/the-canvas-element.html#the-canvas-element>

a frame from a `<video>` tag. As you can see now we have the capability to manage image data directly and perform client-side tasks like image analysis or video manipulation. Obviously there are plenty of JavaScript libraries that give you methods to perform image filtering or generally image manipulation (like [Pixastic](#) or [Camanjs](#)), other libraries give you the possibility to create images on the fly (like [Raphaël](#) or [Processingjs](#)).

The canvas element also provides a 3D context to draw and animate⁹ high definition graphics and models using the WebGL API. This API is maintained by the [Khronos Group](#) and is based on OpenGL ES 2.0 specifications. On top of these APIs there are a lot of libraries¹⁰ created for easy development, the most used is the [Three](#) JavaScript library, that can be used for creating and animating 2D or 3D scenes in the canvas element.

WEBSOCKET The WebSocket is an API interface for enabling bi-directional full-duplex server communication on top of the Transmission Control Protocol (TCP) protocol. The WebSocket enables the clients to create a communication channel between the server and the client, allowing the server to push data to the clients and obtain *real* real-time content updates.

Like other HTML5 features, WebSocket has a library, built on top of the API, that provides easy access to these functionalities as long as a couple of fallbacks. [socket](#) provides a single entry-point to create a connection to the server and manage the message exchange, it also provides a few fallbacks¹¹ to ensure cross-browser compatibility.

WEBWORKERS A problem you have to face when you are building computationally heavy JavaScript code is its single thread nature. Every script runs in the same thread, this can lead to some unwanted behaviour like browser freezing or the newly introduced warning dialog "A script is slowing the browser". The browser shows the dialog to prevent freezing or crashing of the whole browser application, but this dialog prevents the script from fulfilling their task. So how can we execute long running JavaScript computation if the browser stops the code?

[Jenkin, 2008](#) proposed a timed-based programming structure that ensures the code to be run without any browser warning and also offers the developer to tweak the performance of the script by dynamically adjusting the interval between the step execution. This method leverages on the `setTimeout` function of JavaScript in order to split code into timestep-driven code chunks to execute. Here is an example of a loop translated into a time-based loop:

⁹ Animation is not natively supported, you must code it yourself.

¹⁰ For a reference see http://en.wikipedia.org/wiki/WebGL#Developer_libraries

¹¹ WebSocket, Adobe® Flash® Socket, AJAX long polling, AJAX multipart streaming, Forever Iframe, JSONP Polling

```

while condition do
| ...do something...
end

```

```

procedure STEP
| ...do something...
if condition then
| setTimeout(STEP,
| delay)
end

```

Obviously this is not a solution it is a way to hack the browser JavaScript performance monitor and avoid the warning dialog. WebWorkers provide a standard way to create *Workers* that execute in background, also performing heavy computation without harming the browser flow. Let's provide an official definition:

The WebWorkers specification defines an API for running scripts in the background independently of any user interface scripts. This allows for long-running scripts that are not interrupted by scripts that respond to clicks or other user interactions, and allows long tasks to be executed without yielding to keep the page responsive.

So basically fills the gap of parallel code execution in JavaScript.

1.2.2 WebCL

With the advent of General-purpose computing on graphics processing units ([GPGPU](#)), the spreading of multicore CPUs and multiprocessor programming (like OpenMP) we can see emerging an intersection in parallel computing. This intersection is known as **heterogeneous computing**. Open Computing Language ([OpenCL](#)) is a framework for heterogeneous compute resources and so Web Computing Language ([WebCL](#)) is a porting of this technology to the web.

[OpenCL](#) uses a language based on C99¹² for writing *kernels*, functions that actually execute on OpenCL devices.

The main focus when building high-end web-application like 3D games is responsiveness. Although JavaScript can be optimized and parallelized (see [1.2.1 on page 8](#)) it cannot be fast as an application software, because JavaScript must be interpreted by the browser and then executed as machine code. [WebCL](#) provide an easy framework for building and running machine code in parallel directly from the browser.

- Come usiamo noi queste tecnologie
- task monitoring
- SIFT??

¹² A programming language dialect for the past C developed in 1999 (formal name ISO/IEC 9899:1999)

2 | THE MODEL

In this chapter, we define the *architectural model* for our system and the reference infrastructure supporting this model. The *architectural model* is the data model on which the single components of the system are build upon. It describes the components that interact each other during the task lifecycle and embodies also the requirements and the features of the system as expressed in the [introduction](#).

Concerning the data model we have subdivided it in 3 parts, this subdivision is made to better distinguish each of the 3 main steps used in every distribution system in order to create, distribute and process the data. ?? gives an overview of the *architectural model* that is composed by:

THE DATA MODEL: describes the data structure used to create this system.

THE ARCHITECTURAL MODEL: describes the reference architecture of the system.

THE EXECUTION MODEL: focuses on the execution model of the task.

PLUGGABLE STRATEGIES: here are provide some example of strategy that can be plugged to the system.

2.1 DATA MODEL

In this section, we define the *Data model* of the System. All the components used in the *Architectural model* are based on this model and all it's. As can be seen in [Figure 4](#) the *Data model* is composed of 5 parts that together compose a basic human/automatic computation platform.

THE WORKFLOW contains the all the information about a *Work*, including how is composed, in terms of Task, and the relations that intercourse between two or more Task.

THE TASK DATA MODEL contains the actual data structure for each Task or Work.

THE TASK MODEL contains all the data associated to a Task or Work.

THE TASK EXECUTION focus on the actual execution step for each Task, providing information on which implementation to use according to a specific Performer.

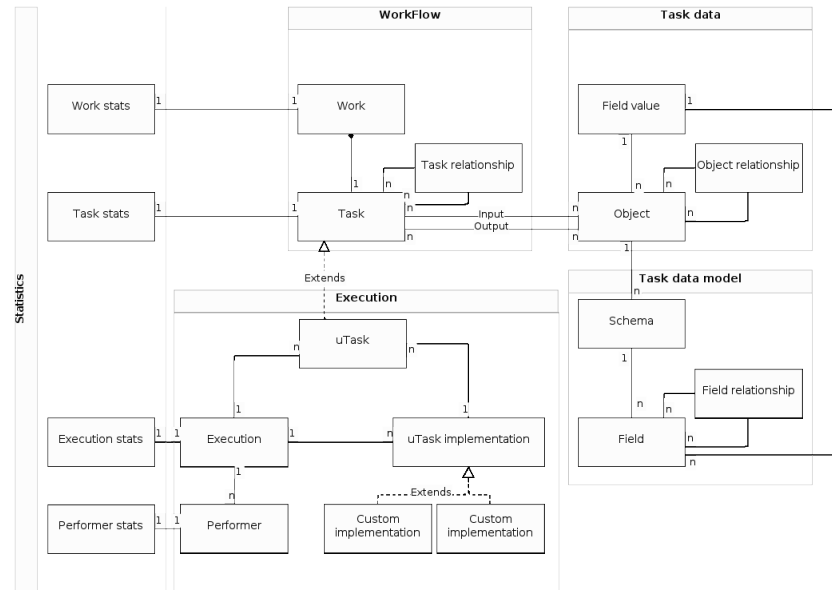


Figure 4.: Data Model.

STATISTICS provide all the statistics associated to the Work lifecycle, from the creation to the execution.

Figure 5.: Conceptual organization of Work, Task and μ Task.

2.1.1 Workflow

The Workflow embodies all the data associated to the *flow* of Task that need to be executed in order to complete a **Work**. As an example consider image tagging with tag validation as a *Work*, to complete this we need to perform a few steps:

1. Let the user tag an image

2. Gather the result tags associated to an image
3. Let some different validate the tags for the image
4. Gather the validation result
5. Output the validated tag

As one can notice this *Work* is subdivided in two main steps, the first when we gather a set of tag from the users, the second when these tags are validated. These two steps are human computation Task that are part of the *Work* of image tagging and validation.

The Work

The Work represent the main goal of the *Requester* and it's defined by:

- A **Name** that identifies the Work.
- **Constraints** defined by the *Requester* used to prioritize the Work among the others (e.g. Due date, Performer skills, Max execution time).
- **Input** data, defined by a *Schema*. To keep the model as general as possible no assumption are made on the *Schema* type (relational, graph, etc.).
- **Output** data, defined as an extension of the input schema (sharing the same schema type).
- A set of **Task**. Their orchestration is made at design time, specifying a *Flow*

The Flow

The Flow describes how the *Task* are connected (organized) to fulfill the requirements of a *Work*. In a Flow we can use control structures and *Variables*. The control structures available are:

- SEQUENCE:** represent the normal flow of an application where one operation is executed after the previous is completed.
- CHOICE:** give the possibility to made choice according to one, or more, *Variables*.
- LOOP:** Allow to execute some steps multiple times, according to a predefined value or a *Variable*.
- PARALLEL:** the steps of the flow are not executed in *Sequence*, allowing the parallelization of some steps.

The *Variables* can be predefined or computed during the Flow execution to change the behaviour of the Flow itself. For instance a variable can decide whether to execute a loop or not or even decide what control sequence to use in the next steps.

The Task

The Task is the kernel of the whole system, it represent an activity, typically focusing on a purpose. A Task is characterized by:

- A **Name** that identifies the Task.
- **Input** data, with a *Schema*. Usually the *Schema* of a Task is a projection of the *Schema* of a *Work*.
- **Output** data, with a *Schema* that is an exetension of the input *Schema*.
- A Task **type**¹ defining, at abstract level, what kind of data manipulation will be performed by a Task. These categorization are taken from [Bozzon, Brambilla, and Ceri, 2012](#), here are a few:
 - Like
 - Order
 - Classify
 - Add
 - ...

Each Task type is defined by:

- I/O relationship, defining, at abstract level, how the Task transforms the data and the schema.
- A default implementation.
- A **Status** encoding the current state of the Task. A Task, can have only one of the following statuses at point of its lifecycle:
 - *Planning-Input*: the Task has been created, have a *Schema* and *Object data* associated and a defined Task *type*.
 - *Planning-μTask*: a set of *μTask* has been associated to the Task.
 - *Planning-Assignment*: a set of *Performers* has been selected to execute the *μTask*.
 - *Wait*: Task planned, *μTask* ready for executioun.
 - *Running*: *μTask* are running.
 - *Ended*: all the *μTask* have completed their execution.
- A set of **Subscribers** able to recieve updates on the Task execution.
- A set of **Execution constraints** used for priortizing the Task among others or to modify the standard behaviour of the task to fullfill these constraints. The availbale constraints are:
 - Maximum execution time

¹ An assumption is made to make the list fit all the possible abstract task our System is able to handle.

- Due date
- TODO others
- **Configuration data**, provided as JavaScript Object Notation ([JSON](#)). For instance the classes we want to use in a classification Task.
- μ **Tasks** TODO????.
- An **Aggregation** function, in charge of collecting the μ Task results and generating the Task output.
- **μ Task planning** strategy, in charge of defining how many μ Task create for a given Task and associate the right portion of input data to such μ Task. For example total disjunction, redundancy, partial overlap, etc.
- **Performer assignment** strategy able to assign *Performers* to μ Task. Some strategies can be: manual, random, most reliable, etc.
- **μ Task implementation** strategy in charge of routing the correct μ Task implementation for each μ Task execution. The routing can be done according to the *user-agent* (e.g. Browser) or to the *user profile* or even *fixed* for all.
- A **Task planning** which embodies the functionalities of *μ Task planning* strategy, *Performer assignment* strategy and *μ Task implementation* strategy deciding the logic behind the invocation of those strategies.
- A **Task control** strategy able to control the status of the Task and if needed perform corrective actions.
- An **Emission policy** specifying which *Subscriber* need to be notified of a Task change in *Status*.

2.1.2 Task Data Model

The Task Data Model contains all the data related to the description of the *Schema* of the data of a Work/Task. This model resembles a the *metadata* of the actual data of the Work/Task defining all the fields and their type according to a *Schema*.

The Schema

The Schema contains all the information related to the data structure of a Work/Task, and its defined by:

- A **Name** that identify the Schema among the others.
- A set of **Fields** that compose the actual schema of the data.
- A list of **Objects** associated to this *Schema*, these objects represents the actual data associated to the Work/Task.

The Field

The Field represent the definition of a Field in a *Schema*, with all the properties that define if the field is calculated, derived, etc. The Field is defined by:

- A **Name** that identify the Field.
- A **type** definig the type of the data that this field contains. i.e. string, number, etc.
- A set **related fields** that defines how this field is composed. TODO ???
- A **relation** that specifies which type of relation occurs among the *related fields*.
- The list of **data** of in terms of the associated *Field values*

2.1.3 Task Data

The Task Data contains the actual data instance for each Task, defined in the *Schema*. All the data are contained in a *Object* that represent the the instance of the Task data (e.g. A row of the Task Data table). Due to the metadata-like model of the System, we need to store all these information into a separate table and use the *Object* as a simple reference table.

The Object

The Object contains the actual data value as reference to field value instances; it's composed by:

- A **Name**.
- A list of field values **data**.
- TODO ??

The Field Value

The Field Value contains the data associated to a particular field, defined in the metadata model. It's defined by:

- An **Object** that define tho what *Object* they refer to.
- The **Field** to wich the datta belongs.
- TODO ???

2.1.4 Task Execution

The Task Exection embodies all the information relative to the actual exection of the code. The majority of these data belongs to the **Execution layer** thus can be phisically located into another piece of software in charge of the execution of the code.

μTask

The *μTask* is the implementation of a Task that insist on a specific subset of data of the Task. Can be also considered as an activity assigned to one or more Performers. It is defined by:

- A **Name**.
- A list of **Execution**, representing the actual activities performed by a *Performer*
- A set of **Execution constraints**.
- **Input** data, as a subset of the Task input data.
- **Output** data, with the same schema as the related Task output data.
- A list of **Properties**, defined as name-value pairs, having domain specific meaning.
- One or more **μTask implementation**.

The Execution

The Execution is related to one *Performer* that need to compute a *μTask*. An Execution is defined by:

- a **Status** telling the status of the execution of the *μTask*, the available statuses are:
 - *running*
 - *suspended*
 - *idle*
 - *ended*
- A set of **Execution data** provided as **JSON** object.
- A **μTask Implementation**

μTask implementation

The *μTask Implementation* is the actual application logic and presentation delivered to a *Performer* to run a *μTask*. The System provides a default implementation according to the Task type, in addition, a *Requester* can specify one or more Custom implementations, in order to obtain more control over the execution process.

Performer

A Performer is a human being able to execute one or more *μTask*. The performer is characterized by a set of attributes such as:

- A **Name**

- **Demographic** information
- **Performance** information
- **Trustworthiness**
- **Social properties**

2.1.5 Statistics

This Statistics model contains all the information related to the Task profiling and statistics used to tweak the performance of a Task, or used by components (like the *Task controller*) to take decision on the Task flow. In this model are contained data about *Work*, *Task*, μ *Task*, *Performer*, etc. The data contained in these tables can be:

- **Creation date**
- **Total execution time**
- **Average number of *Performers*/h**
- **Last execution**
- etc.

2.2 ARCHITECTURAL MODEL

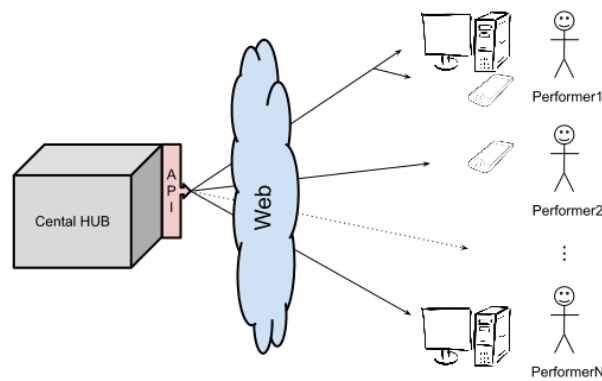


Figure 6.: Reference architecture.

The system use as a reference architecture the one depicted in [Figure 6](#). Here we have a centralized hub that *defines* and *distribute* the workload, a plethora of clients with their browsers and the users. The clients of this model are all coherent and transparent to the execution of the code, which is distributed to the end-user according to the platform they are using. As you can see the structure is almost the same as any other task distribution platform, the strengths of this system are in the characterization of the actors in the system.

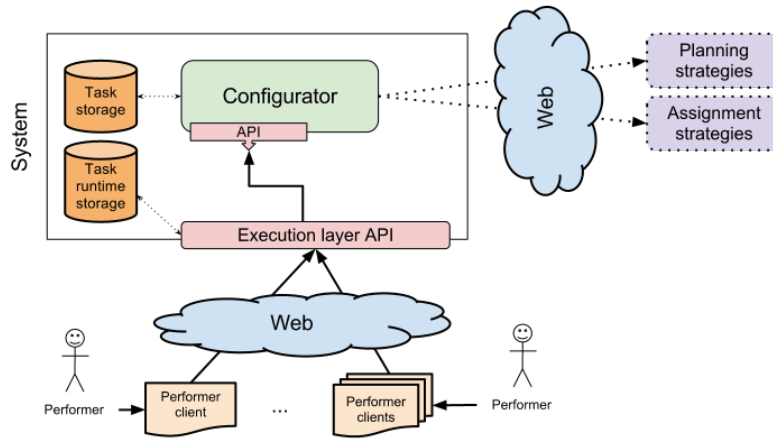


Figure 7.: Specialized architecture.

The reference model in Figure 6 has been customized to meet our needs of flexibility and pluggability, so we introduced a *configurator* and a *execution layer* in the central hub. These are the components that allow our system to cover all the dimension presented in Table 1.

The **configurator** is in charge of defining and configuring a task in the system, allowing the *requester* to add hooks to external resource in order to manage the assignment cycle and the planning strategy.

The **execution layer** provides useful API for managing the μ Task and communicate with the *configurator*.

2.2.1 Configurator

The **Configurator** is the component in charge of the task lifecycle management. The principal functionalities offered by the **Configurator** are:

- Allow the **creation** of a Task, also at abstract level, using either the API or the built-in UI.
- Allow a *Performer* to **execute** the Task using a standard non configurable UI, provided as-is for each Task type.
- Allow to **request information** about a Task, the information that can be requested includes:
 - Retrieve the list of μ Task associated with a given Task
 - Post the result of the execution of a given μ Task
 - Notify about the completion of a Task or μ Task

Alongside these main functionalities it offer a *Requester* the ability to monitor the state of a Task and/or a μ Task.

2.2.2 Execution layer

This component is in charge of managing the μ Task implementation for each Task or for each μ Task. The implementations have a fallback behaviour so, if a custom μ Task implementation is not present then the system search for a custom Task implementation, if this is missing then the built-in implementation is used. On top of this fallback system the component offer the possibility to create code for a target platform.

The **Execution layer** offer the following functionalities:

- Allow a *Requester* to configure the implementations associated to a Task and/or a μ Task. The implementations are configured specifying the target platform (mobile, desktop, tablet, ...) and the executable resources used by the implementation (i.e. HTML, CSS and JS files). Wich implementation to use is configured later in the *Planning* step.
- Create a layer of abstraction between the implementation and the Configurator, creating a sandboxed environment where the implementation can run and communicate with the Configurator.
- Allow the *Performer* to execute a specific μ Task implementation.

2.2.3 Task storage & task runtime storage

These are the storage areas where we put all the data associated with the Task. We used two separated storage area in order to keep the runtime configuration separated from the abstract configuration data of the Task.

The task runtime storage contains all the ad-hoc code written by the *Requester* for each platform. **This code can be reused by the other *Requester* to execute the same task (for example image tagging).**

2.2.4 Performer & Performer client

The *Performer client* represents the platform (like desktop or mobile) on wich a *Performer* executes the Task implementation. The *Performer client* make use of the *Execution layer API* to retrieve the correct implementation, communicate the status during the exection of a μ Task and post the result of the execution. The *Performer* is the actual user that is using the *client*.

2.2.5 Planning strategies

Any third-part component in charge of the creation and management of the μ Task associated with a Task. During the Task configuration step the *Requester* decide when this external component need to be called. The *Planning strategy* can be called only once, for example during the task creation, or ca behave like an handler to the μ Task ended

event, in this case the *strategy* is able to decide whether is necessary to spawn other μ Task execution to fulfill the requirements.

2.2.6 Assignment strategies

Any third-part component used to associate μ Task to Performers. The binding can leverage on some skill of the Performer, for example a strategy can be: associate this set of μ Task to Performers skilled German translation, and all the other to any Performer. As for the *Planning strategies* this component can be invoked only once or in response to some events (like μ Task ended or created).

2.3 EXECUTION MODEL



Figure 8.: Representation of the Task execution flow.

[Figure 8](#) represents the flow of the execution of a Task during the execution. As one can notice the flow is almost straightforward except the initial part when the *Task control* strategy tweak the execution to fulfill some predefined requirements.

The System is able to operate in different scenarios, according to the logic implemented in the *Task planning*, the *Task control* strategy may change the flow of the execution. In [Table 2](#) are presented the different execution scenarios that the system is able to handle.

Table 2.: Task planning vs. Task Assignment.

	Static	Dynamic
Static	2.3.1	2.3.2
Dynamic	2.3.3	2.3.4

2.3.1 Static execution

This scenario of execution represent the simplest use-case possible, where the *Task planning* is executed only once at creation time and the μ Task are planned and assigned only once. In this mode the *Task control* have only the role of controlling if the *constraints* are verified. Here is a list of the operation that the *Task control* strategy must perform:

- **Stop** a Task if constraints are met.
- **Invoke** the *Aggregation function* at the end of the Task execution.
- **Notify** the *Subscribers* about the Task execution.

2.3.2 Static μ Task planning & Dynamic assignment

In this scenario the μ Task are planned once at creation time, but the assignment is performed dynamically. In this scenario the *Task control* strategy invokes the *Performer assignment* strategy to assign *Performers* to μ Task, ensuring that the constraints are verified. The *Task control* strategy can also decide to reassign *Performers* to μ Task, while ensuring constraints validity. In this scenario the *Task control* strategy:

- **Stop** a Task if constraints are met.
- **Invoke** the *Aggregation function* at the end of the Task execution.
- **Notify** the *Subscribers* about the Task execution.
- **Invoke** the *Performer assignment* strategy to bind μ Task to *Performers*.

2.3.3 Dynamic μ Task planning & Static assignment

In this scenario the *Performer* assignment are performed at creation time and the μ Task planning is performed during the flow of the execution. As one can notice this can lead to consistency problem due to the missing μ Task during the binding step. Since this scenario can lead to consistency problems it must be used with care with respect to the others. To avoid problem we suggest to use simple *Performer* assignment such as the *fixed* one, using this strategy we do not have to take care of the consistency. Summing up, the Task Control Strategy:

- **Stop** a Task if constraints are met.

- **Invoke** the *Aggregation function* at the end of the Task execution.
- **Notify** the *Subscribers* about the Task execution.
- **Invoke** the *Task planning* strategy to *re-plan* μ Task or **Create** new μ Task

2.3.4 Dynamic μ Task planning & Dynamic assignment

In this scenario all the assignments are performed dynamically. Here the μ Task can be associated either at creation time or during the flow of the execution. The same stands for the *Performer* assignment, this can be done at any time, i.e. *Performers* can be assigned only upon the request of a Task execution. Summing up, the Task Control Strategy:

- **Stop** a Task if constraints are met.
- **Invoke** the *Aggregation function* at the end of the Task execution.
- **Notify** the *Subscribers* about the Task execution.
- **Invoke** the *Performer assignment* strategy to bind μ Task to *Performers*.
- **Invoke** the *Task planning* strategy to *re-plan* μ Task or **Create** new μ Task

2.4 PLUGGABLE STRATEGIES ASSIGNMENT

In this section are covered the pluggable strategies that can be *replaced* by the *Requester* during the creation of a *WorkFlow*, first we present the standard implementation in the System, then we give an overview on the possible custom strategies that can be replaced.

2.4.1 Built-in strategies model

Here are presented the models of the default implementation for the pluggable strategies. These default models are quite flexible to allow the creation of most of the common Task that need a distributed approach, but other distributed human Task, like [GWAP](#), must have a direct control over the whole execution flow.

μ Task planning strategy

μ Task planning strategy is a pluggable logic focused on the organization and spawning of the μ Task in order to execute a Task. A Task planning strategy is defined by:

- A set of **Constraints** that rule the execution.
- A **Planning policy** that can be defined at:

DESIGN TIME: the assignment is made at design time during the creation phase. After the planning is done it can be modified only

DYNAMIC: the planning is done at least once, using a provided set of input *Objects*. The planning can be further invoked due to:

- *Variations* in the state of the Task. i.e. an object can be reassigned to another μ Task.
- *Addition* of new *Objects* through the API.

Note that the addition of new μ Task can be performed using the API but usually do not involve the invocation of a μ Task planning strategy.

This strategy produce as output a set of μ Task with the corresponding *Objects*.

Performer assignment strategy

The Performer assignment strategy is a pluggable logic devoted to the assignment *Performers* to μ Task. A Performer assignment strategy is composed by:

- A set of **Constraints**.
- A list of **routes** that, by matching the description of a *Performer*, decide if a μ Task can be assigned to a *Performer*.
- An **Assignment policy** that can be:
 - ONE-SHOT:** the assignment is performed according to a predefined number of *Performers* and μ Task.
 - DYNAMIC:** the assignment is performed at least once and can be invoked multiple times later according to *Variables* that can change over time.

μ Task implementation strategy

μ Task implementation strategy is a pluggable logic in charge of selecting a suitable μ Task implementation for an *Execution*. A μ Task implementation strategy is characterized by:

- A set of assignment **Constraints**.
- A list of **routes** that, by matching the description of an *Execution*, decide if a μ Task can be assigned to an *Execution*.
- An **Assignment policy** that can be:
 - STATIC:** the assignment is performed according to a predefined number of *Performers* and μ Task.
 - DYNAMIC:** the assignment is performed at least once and can be invoked multiple times later according to *Variables* that can change over time.

Task planning strategy

Task planning strategy embodies the functionalities of a μ Task planning strategy and of a Performer Assignment strategy, deciding the logic by which the two strategies should be invoked.

Task control strategy

The Task control strategy is a pluggable logic devoted to verifying the status of a Task, possibly against the assigned constraints. The logic can be executed:

- **Once** when the Task ends.
- According to a **temporal schedule**.
- Every time a μ Task is **executed**.

The corrective actions available to the Task controller are:

- The **re-planning** of the task, also with the creation of new μ Task.
- The **re-assignment** of μ Task to *Performers*.
- **Delete** of executed μ Task.
- **Change** the properties of an executed μ Task.
- **Re-execution** of the entire Task.
- **Halting** the Task.
- Etc.

Aggregation function

An Aggregation function is a pluggable logic devoted to the summarization of the results of several μ Task aimed at creating the final output data of a Task. Examples of aggregation functions are Sum, Avg, MajorityAgreement, etc.

Emission policy

The Emission policy is a pluggable logic in charge of notifying the *Subscribers* about the status of a Task. This logic can be executed:

- **Once** the Task ends.
- According to a **temporal schedule**.
- Every time a task is **executed**.

2.4.2 Custom strategies

TODO ???

Example 1

TODO ???

Example 2

TODO ???

3 | THE USE-CASES

This chapter will cover the use-cases used to test the System. These use-cases represents the principal scenarios where there is a need of a distributed platform to spread the computation, or the computation itself is distributed (like the [GWAP](#)). These use-cases are also chosen to stress the matrix in [Table 1](#), in particular the *voluntary* part, because the *involuntary* part can be implemented straightforward.

At the end of every use-case will be presented a benchmark/metric, if available, with the corresponding available tools.

3.1 AUTOMATIC

This use-case is the implementation of the *voluntary-automatic* scenario presented in the matrix [Table 1](#).

Automatic use case

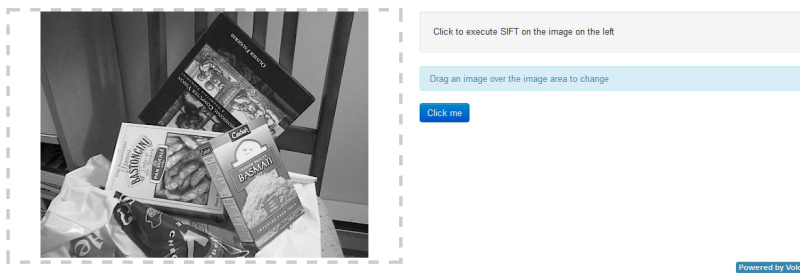


Figure 9.: Interface of the automatic use-case.

For the Automatic use case we choose to implement a widely used feature detection algorithm, the Scale-Invariant Feature Transform ([SIFT](#)). To perform this load intensive algorithm we used the power of the [WebCL](#) framework to greatly speedup the computation.

In order to build a working example of the algorithm we started with the creation of an abstraction layer over the [WebCL](#) raw implementation, then we created a small *MultiMedia* library able to compute the needed operation on the images using our *abstraction layer* eventually we implemented the algorithm in the *MultiMedia* library.

THE ABSTRACTION LAYER is in charge of the communication with the raw Nokia WebCL framework as well as creating a stateful object capable of managing of the I/O data for a WebCL *kernel*.

THE MULTIMEDIA LIBRARY is used to perform the operation required by the algorithm (such as blur, scale, RGB to gray etc.) either using [WebCL](#) or the built-in HTML5 functions.

Automatic use case

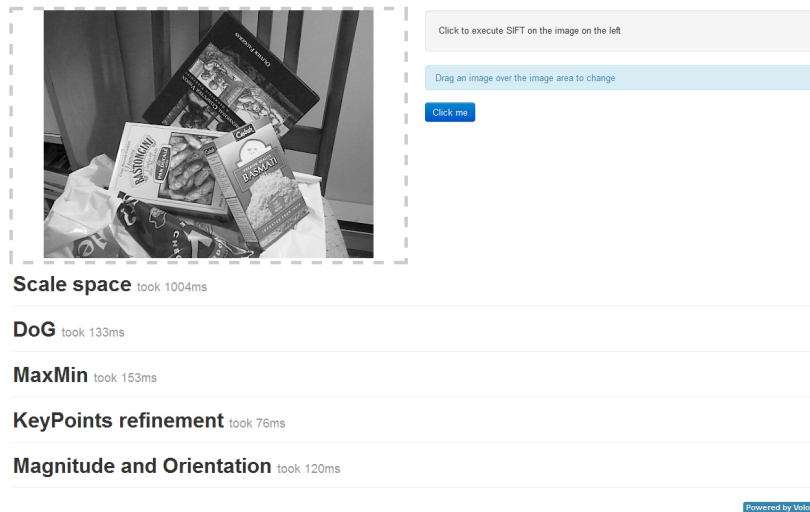


Figure 10.: Intermediate results of the algorithm.

THE ALGORITHM is composed of 4 sequential steps:

SCALE-SPACE EXTREMA DETECTION: in this step we generate the so called scale space representation of the image. In order to do this we need to convolve the image at different scales with a varying gaussian kernel and then the difference of successive blurred images are taken. This step produce the Difference of Gaussian (**DoG**) images, the first *Keypoints* are identified as local minima/maxima of the **DoG** image across scales.

KEYPOINT LOCALIZATION: in this step the *keypoints* are filtered to remove unstable points and keep only the good ones. This step can be further subdivided into 3 stages

- *Interpolation* of nearby data for accurate position.
- *Discarding* low-contrast keypoints.
- *Eliminating* edge responses.

ORIENTATION ASSIGNMENT: in this step for each keypoint is assigned an orientation and a magnitude. This step is used to achieve *invariance rotation*.

KEYPOINT DESCRIPTOR: this step generate the descriptors for the remaining keypoints.



Figure 11.: SIFT result comparison with the reference data.

Benchmark/Metric

Since the purpose of this use-case is the feasibility of high load computation on the user browser, the implementation of the algorithm has not been optimized. The performance of this implementation are not comparable to the existing implementation in C/C++, but we can leverage on the parallelism of the whole system to obtain usable results.

Nevertheless in our test cases we obtained the following results:

Table 3.: SIFT performance.

Image size	ScaleSpace + Dog	Keypoints detection	Total time
400x360	1130ms	310ms	1500ms
400x360	1130ms	310ms	1500ms
400x360	1130ms	310ms	1500ms
400x360	1130ms	310ms	1500ms

3.2 HUMAN

Dato un testo disambiguarlo usando YAGO (AIDA, <https://d5gate.ag5.mpi-sb.mpg.de/webaida/>), EntityPedia?, e altri *Modernizr*

Benchmark

3.3 HYBRID (AUTOMATIC+HUMAN)

This use-case is the implementation of an *hybrid* use-case that embodies both the automatic and the human scenario. In the matrix at Table 1 this use case is placed between the human and the automatic, voluntary, scenario.

Hybrid use case

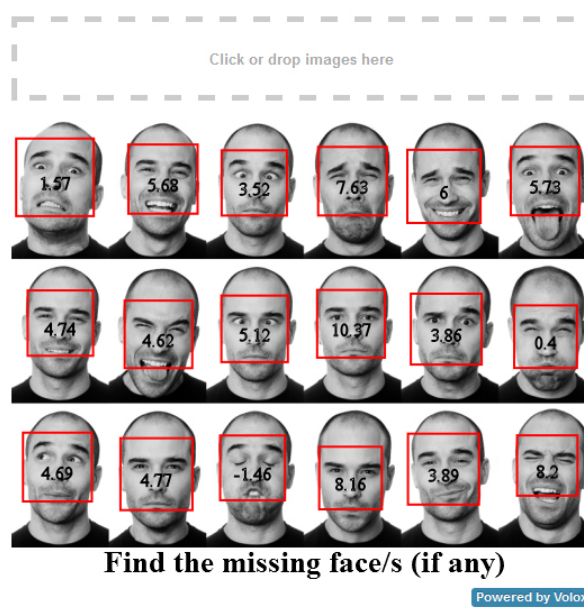


Figure 12.: Interface of the hybrid use-case.

This use-case has the purpose of *detecting faces* in a picture, to accomplish this task are used an automatic face recognition algorithm¹ plus a human interaction that has the double purpose of validating the algorithm result and detect the missing faces in the image.

This scenario is implemented in 2 steps, in the first step we run the algorithm for detecting the faces (this is the *automatic* scenario), in the second step we present a subset of detected faces to the user asking to find the missing faces. We need to remove some result from the set in order to check the trustworthiness of the user.

At the end of the execution we obtain a set of automatically detected faces plus all the faces detected by the user. By intersecting this two set we could improve the performance of our algorithm by adding the faces it was unable to find to the training set.

Benchmark/Metric

With this hybrid approach we are able to stress all the matrix in with a single example. The most similar approach to this solution is [GWAP](#).
TODO ???

¹ Available at <https://github.com/liuliu/ccv/tree/unstable/js> with a demo application here: <http://liuliu.me/ccv/js/nss/>

4 | IMPLEMENTATION AND EVALUATION

4.1 ARCHITECTURE

4.2 PERFORMANCE COMPARISON???



CONCLUSION AND FUTURE WORKS

ACRONYMS

HTML5	HyperText Markup Language version 5 HTML5 is a markup language for structuring and presenting content for the World Wide Web, and is a core technology of the Internet originally proposed by Opera Software.
WebCL	Web Computing Language The WebCL working group is working to define a JavaScript binding to the Khronos OpenCL standard for heterogeneous parallel computing. WebCL will enable web applications to harness GPU and multi-core CPU parallel processing from within a Web browser, enabling significant acceleration of applications such as image and video processing and advanced physics for Web Graphics Library (WebGL) games.
SIFT	Scale-Invariant Feature Transform SIFT is an algorithm in computer vision to detect and describe local features in images.
OpenCL	Open Computing Language OpenCL is a framework for writing programs that execute across heterogeneous platforms consisting of CPU, GPU, and other processors. OpenCL includes a language (based on C99) for writing <i>kernels</i> (functions that execute on OpenCL devices), plus APIs that are used to define and then control the platforms. OpenCL provides parallel computing using task-based and data-based parallelism.
WebGL	Web Graphics Library WebGL is a cross-platform, royalty-free API used to create 3D graphics in a Web browser. Based on OpenGL ES 2.0, WebGL uses the OpenGL shading language, GLSL, and offers the familiarity of the standard OpenGL API. Because it runs in the HTML5 Canvas element, WebGL has full integration with all DOM interfaces.
CORS	Cross-origin Resource Sharing Cross-origin resource sharing (CORS) is a web browser technology specification which defines ways for a web server to allow its resources to be accessed by a web page from a different domain. Such access would otherwise be forbidden by the same origin policy. CORS defines a way in which the browser and the server can interact to determine whether or not to allow the cross-origin request. It is a compromise that allows greater

flexibility, but is more secure than simply allowing all such requests.

RIA	Rich Internet Application Rich Internet Applications (RIA) are web-base application taht have many of the characteristics of desktop application software.
HIT	Human Intelligent Task
TCP	Transmission Control Protocol
JSON	JavaScript Object Notation
AJAX	Asynchronous JavaScript and XML
CSS3	Cascading Style Sheets
BOINC	Berkeley Open Infrastructure for Network Computing
GWAP	Game With A Purpose
GPGPU	General-purpose computing on graphics processing units
SETI@home	Search for Extra-Terrestrial Intelligence <i>at</i> home SETI@home is an Internet-based public volunteer computing project employing the BOINC software platform, hosted by the Space Sciences Laboratory, at the University of California, Berkeley, in the United States. Its purpose is to analyze radio signals, searching for signs of extra terrestrial intelligence, and is one of many activities undertaken as part of SETI.
DoG	Difference of Gaussian

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