

# Using algorithmic skeletons in EcmaScript to parallelize computation in browsers through Web Workers

Damian Schenkelman and Matias Servetto

School of Engineering, University of Buenos Aires.  
Paseo Colon 850, Buenos Aires, Argentina  
{dschenkelman,mservetto}@fi.uba.ar  
<http://www.fi.uba.ar/>

**Abstract.** With the growing tendency of browsers being used for CPU intensive applications (such as 3D games) it is important to take advantage of multiple cores to reduce user perceived latency. This paper presents a JavaScript library based on algorithmic skeletons that allows users to take advantage of parallel processing in browsers while maintaining a familiar coding style.

**Keywords:** browsers, ecmaScript, parallelization, algorithmic skeletons

## 1 Introduction

In 1965 Gordon Moore proposed the popularly known “Moore’s law” [1], which predicts that the number of transistors in integrated circuits will double every two years. As a consequence, programs that use a single processor/core will automatically become faster without the need to modify them with that purpose in mind.

In the year 2010 it was predicted that this tendency would be slowly reaching its end, mostly due to reasons related to heat dissipation. This is the cause why newer computer have a greater number of processors instead of processors with more computing power.

To be able to maximize the performance of these computers, it is paramount that systems professionals can create programs that process data in parallel, through different mechanisms, such as threads or processes executing simultaneously in different processors. In the case of application executed on a single device (e.g. browsers and web pages, applications for mobile devices, desktop apps, server applications) a lot of languages and platforms provide a simple way for programmers to abstract the complexity and coordination required for this type of processing. For example, the .NET platform has the Task Parallel Library (TPL) and Parallel LINQ (PLINQ) [2] libraries that use algorithmic skeletons modelled with high order functions so developers can perform complex operations through a simple API.

On a different note, one of the tendencies that is beginning to take off is the use of EcmaScript [3] (also known as Javascript) to create applications that were previously only considered viable in a native environment, such as video games. This has been possible thanks to components like asm.js [4] and WebGL [5] together with the constant evolution of browsers and JavaScript runtime engines. In this context, one of the plans of the committee that develops the language is to provide an API to simplify the processing of data in parallel for version 7 (ES7) of the language, with the goal of keeping up with native applications. Initiatives such as ParallelJS [7] and River trail [6] or the possibility of taking advantage of SIMD instructions [8] (single instruction multiple data) are some of the options to implement this.

The goal of this paper is to provide an alternative for parallel code execution in EcmaScript, through a library that exposes high order functions to model algorithmic skeletons such as map, filter and reduce. This library will take advantage of Web Workers [9] (the mechanism proposed by browsers for parallelism at the time of writing) to allow the simultaneous execution of code in multiple processors.

## 2 Background

All modern versions of major browsers (Internet Explorer, Mozilla Firefox, Google Chrome, Safari and Opera) allow the execution of JavaScript code in a single threaded event loop runtime [10]. User actions add elements to the event loop queue and these are processed sequentially. All process input/output is asynchronous to prevent the UI thread from blocking, thus keeping it responsive. While such a runtime is a good fit for most web applications, JavaScript and the browser are now also being used for some CPU intensive tasks, such as games, which commonly require physics calculations, image manipulation (in 2D) and graphics generation (in 3D). Despite the large improvement in JavaScript performance obtained through optimizing compilers such as Google Chrome's V8 [11] and Mozilla Firefox's SpiderMonkey [12], it is important to be able to take advantage of multiple cores in modern devices to achieve even greater performance.

In 2010, Web Workers were made part of the web standard. Web Workers allow the creation of "thread like" constructs in a browser environment, but they don't allow on shared memory and instead communicate via message passing. The message passing overhead is very big for common objects and Web Workers have a considerable startup time, so they were commonly considered for long running tasks and operating on generally the same set of data during a single execution, making them unfit for a thread pool model [13].

However, a recent proposal for version 7 of the EcmaScript standard changes this, by introducing the notion of shared memory through **SharedArrayBuffers**. In essence, the proposal allows the same memory to be shared across multiple Web Workers, and also aims to provide the necessary atomic/lock constructs to deal with shared memory. In the particular case of embarrassingly parallel compu-

tations (such as map, filter and reduce operations on an array), it is simple to take advantage of the shared memory speed benefits without incurring in any overhead due to locks.

### 3 Serialization and Transference

Let's consider an array of  $N$  elements on which a particular transformation is to be performed through the `map` function. If the transformation is executed using a single thread (no parallelism) and the average time to process each element is  $t$  then the total time ( $T_{ser}$ ) for the operation can be approximated as:

$$T_{ser} = \sum_{i=0}^N t = Nt . \quad (1)$$

When trying to parallelize this operation using  $K$  threads the ideal goal is to reach a total time ( $T_{par}$ ) that is:

$$T_{par} = \frac{T_{ser}}{K} . \quad (2)$$

Nevertheless, there are additional time consuming tasks other than the main computation that need to be considered when performing the operation in parallel in programs where not all memory is shared. These are:

- Serializing/deserializing the elements to transfer.
- Transferring the elements back and forth between the UI thread and the workers.
- Serializing/deserializing the function to transfer.
- Transferring to each worker the functions for the transformation.

If we drill down into the different parts:

- $T_{ft}$  as the function transfer time
- $T_{et}$  as the elements transfer time
- $T_{fs}$  as the function serialization/deserialization time
- $T_{es}$  as the elements serialization/deserialization time

It is clear that:

$$T_{sync} = T_{ft} + T_{et} + T_{fs} + T_{es} . \quad (3)$$

$$T_{par} \approx \frac{T_{ser}}{K} + T_{sync} . \quad (4)$$

Based on Eq. 3 and Eq. 4 it can be deduced that the more  $T_{sync}$  can be reduced, the closer to the ideal scenario the computation will be.

In our case we are trying to transfer objects between a browser's JavaScript UI thread and Web Workers so we are constrained by the means of that environment. The Worker interface is the following [9]:

*Web Worker interface*

```
[Constructor(DOMString scriptURL)]
interface Worker : EventTarget {
    void terminate();

    void postMessage(any message, optional sequence<Transferable> transfer);
    [TreatNonCallableAsNull] attribute Function? onmessage;
};
Worker implements AbstractWorker;
```

(Example extracted from the W3C Web Workers specification)

As the aforementioned interface states one can either send just a message or send a message with a sequence of transferable objects. From section 2.7.5 of the HTML Standard [14]: *“Some objects support being copied and closed in one operation. This is called transferring the object, and is used in particular to transfer ownership of unsharable or expensive resources across worker boundaries.”*

### 3.1 Elements

Considering the definition of a **Transferable**, it seems like a good alternative to minimize both  $T_{et}$  and  $T_{es}$ . Even more so when one considers that otherwise objects are copied using structured cloning (explained in section 2.7.6 of that same standard).

To verify our hypothesis, we put together two benchmarks<sup>1</sup> that aim to verify the difference between invoking `postMessage` with and without structured cloning for a **SharedTypedArray**. Both transfer a **SharedTypedArray** back and forth between the UI thread and a worker; the only difference between the two is that one has 100000 (a hundred thousand) elements in the **SharedTypedArray** and the other one 1000000 (a million). As it can be seen from the results in Tab. 2, increasing the amount of elements by 10x does not change the amount of operations that can be performed when using **Transferable** objects, it scales. On the other hand, the amount of operations that can be performed with structured cloning greatly decreases.

For that reason our library only works with **SharedTypedArrays** and **TypedArrays**.

Computer	Mac Book Air
Processor	Intel Core i5
Clock Frequency	1.8 GHz
System Memory	4 GB
Operating System	OS X Yosemite 10.10.3
Browser version	Firefox Nightly 40.0a1 (2015-04-26)

**Table 1.** Benchmarks environment.

<sup>1</sup> All benchmarks in this document use the environment described in Tab. 1.

Elements	Cloning [ops/sec]	Transferring [ops/sec]
1E5	972	<b>1705</b>
1E6	114	<b>754</b>

**Table 2.** Difference between transferring and cloning shared buffers.

### 3.2 Functions

The library must handle the distribution of the code between the different workers when an operation is executed. This is a challenging problem with a lot of possible alternatives [15] [16].

A naive approach would be to try to transfer a function as part of the `message` parameter of `postMessage` but that is not an option (it throws an error).

Considering the fact that `Function` objects cannot be directly transferred a different serialization approach is to be considered (Sec. ?? proposes a solution to sharing additional data and functions between the UI thread and workers) a possible alternative is to:

1. Serialize the `Function` to a `String`.
2. Transfer the `String` to the worker.
3. Create a new `Function` on the worker from that `String`.

**Serialization and deserialization** One possible way of passing serialized `Function` to workers would be to encode them as binary and transfer them as an `ArrayBuffer`. To encode the strings there are two possible approaches:

- Using the Encoding API[17]
- Implementing non native encoding/decoding functions

The benchmarks provided the following results:

Native encoding API [ops/sec]	Non-native function [ops/sec]
<b>5247</b>	4685

**Table 3.** Difference encoding/decoding strings natively and in JavaScript.

**Transference** `Function`'s code not only needs to be serialized but also transferred. For that reason it was also worth comparing the time it takes to encode/decode a `String` and transfer the resulting `ArrayBuffer` to the worker against just passing the `String` to the worker.

Additionally, in most scenarios code would have to be sent along with a `TypedArray` so it would also be interesting to see if the transfer time was affected by this fact.

We created a benchmark using two functions whose string representation has different lengths to see if the function's length affected the serialization and transfer time (results in Tab. 4). We measured three approaches to transfer the string:

1. Encoding the `String` into an `TypedArrayBuffer`, sending it as a `Transferable` and decoding it on the Web Worker.
2. Sending the `String` directly.
3. Using a `Blob` to store the stream and retrieving that in the Worker.

Function length	Blob [ops/sec]	Copy [ops/sec]	Transferable [ops/sec]
Short	1251	<b>7046</b>	6219
Long	705	1176	<b>1198</b>

**Table 4.** Sending function strings from UI thread to Web Workers.

We also created a benchmark that transfers a `SharedTypedArray` and a `String` that are properties of the same `message` object back and forth between the UI thread and a Web Worker to understand if transferring additional objects affected the transfer time when comparing it with just transferring a `String` (results in Tab. 5).

Copying code [ops/sec]	Transferring code [ops/sec]
4200	<b>4340</b>

**Table 5.** Sending code and a `TypedArray` to a Web Worker.

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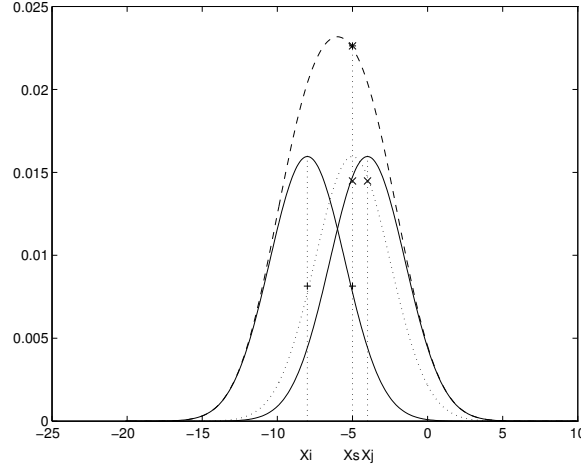
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**Fig. 1.** One kernel at  $x_s$  (*dotted kernel*) or two kernels at  $x_i$  and  $x_j$  (*left and right*) lead to the same summed estimate at  $x_s$ . This shows a figure consisting of different types of lines. Elements of the figure described in the caption should be set in *italics*, in parentheses, as shown in this sample caption.

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*Example of a Computer Program*

```
program Inflation (Output)
{Assuming annual inflation rates of 7%, 8%, and 10%,...
 years};
const
  MaxYears = 10;
var
  Year: 0..MaxYears;
  Factor1, Factor2, Factor3: Real;
begin
  Year := 0;
  Factor1 := 1.0; Factor2 := 1.0; Factor3 := 1.0;
  WriteLn('Year 7% 8% 10%'); WriteLn;
  repeat
    Year := Year + 1;
    Factor1 := Factor1 * 1.07;
    Factor2 := Factor2 * 1.08;
    Factor3 := Factor3 * 1.10;
    WriteLn(Year:5,Factor1:7:3,Factor2:7:3,Factor3:7:3)
  until Year = MaxYears
end.
```

(Example from Jensen K., Wirth N. (1991) Pascal user manual and report. Springer, New York)

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