Transforming Javascript event-loop into a scalable pipeline

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ABSTRACT

The development of a web application often starts with a feature-oriented approach allowing to quickly react to users feedbacks. However, this approach poorly scales in performance. Yet, the audience of a web application can increase by an order of magnitude in a matter of hours. This first approach is unable to deal with the higher connections spikes. It leads the development team to adopt a scalable approach often linked to new development paradigm such as dataflow programming. This represents a disruptive and continuity-threatening shift of technology. To avoid this shift, we propose to abstract the feature-oriented development into a more scalable high-level language. Indeed, reasoning on this high-level language allows to dynamically cope with audience growth and decrease.

We propose a compilation approach that transforms a Javascript, single-threaded web application into a network of small independent parts communicating by message streams. We named these parts *fluxions*, by contraction between a flow ¹ and a function. The dynamic reorganization of these parts in a cluster of machine can help an application to deal with its load in a similar way network routers do with IP traffic. We evaluate this approach by applying the compiler to real web applications. We successfully transform a web application to parallelize the execution of an independent part and present the results.

Categories and Subject Descriptors

Software and its engineering [Software notations and tools]: Compilers—Runtime environments

General Terms

Compilation, dataflow, code transformation

Keywords

Flow programming, Web, Javascript

1. flux in french

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1. INTRODUCTION

The growth of web platforms is partially due to Internet's capacity to allow very quick releases of a minimal viable product (MVP). In a matter of hours, it is possible to release a prototype and start gathering a user community. "Release early, release often", and "Fail fast" are the punchlines of the web entrepreneurial community. It is crucial for the prosperity of such project to quickly validate that the proposed solution meets the needs of its users. Indeed, the lack of market need is the number one reason for startup failure ². That is why the development team quickly concretises an MVP using a feature-driven approach and iterates on it.

If the service successfully complies with users requirements, its community might grow with its popularity. The service needs to be scalable to be able to respond to this growth. However, feature-based development best practices are hardly compatible with the requirement of scalability. The features are bundled in modules which spread through the code base. This organization in modules overlaps and disturbs the organization of a scalable execution. Eventually this growth requires to discard the initial approach to adopt a more efficient processing model. Many of the most efficient models decompose applications into execution units, disregarding the initial feature oriented approach. This decomposition may be spread over a cluster of commodity machines [6]. MapReduce [4] and the Staged Event-driven Architecture (SEDA) [16] are famous examples of that trend. Once split, the service parts are connected by an asynchronous messaging system. Many tools have been developed to express and manage these service parts and their communications. We can cite Spark [18], MillWheel [1], Timestream [13], Naiad [10] and Storm [14], and many others. However, these tools are in disruption from the initial approach. It requires the development team either to be trained or to hire experts, and more importantly, to start over the initial code base. This shift causes the development team to spend development resources in background without adding visible value for the users. It is a risk for the evolution of the project as the number two and three reasons for startup failures are running out of cash, and missing the right competences².

The risks described above come from a disruption between the two levels of application expression, the feature level and the execution level. To lift these risks, we propose a tool to identify the alignment between the two levels, so as to allow a continuous transition from one to the other and back. We focus on web applications driven by users requests, develo-

^{2.} https://www.cbinsights.com/blog/ startup-failure-post-mortem/

ped in Javascript using the Node.js execution environment.

Javascript is increasingly used to develop web applications. It is the most used language on Github³ and StackOverflow 4. We think that it is possible to analyze this type of application as a stream of requests, passing through a pipeline of stages. Indeed, the event-loop used in Node.js is very similar to a pipeline architecture. We propose a compiler to transform a Javascript application into a network of autonomous parts communicating by message streams. We named these parts fluxions, by contraction between a flux and a function. We are interested in the problems arising from the isolation of the global memory into these fluxions. The contribution of this paper is the resolution of these problems, allowing the compilation. We present an early version of this tool as a proof of concept for this compilation approach. We start by describing in section 2 the execution environment targeted by this compiler. Then, we present the compiler in section 3, and its evaluation in section 4. We compare our work with related works in section 5. And finally, we conclude this paper.

2. FLUXIONAL EXECUTION MODEL

In this section, we present an execution model to provide scalability to web applications. To achieve this, the execution model provides a granularity of parallelism at the function level. Functions are encapsulated in autonomous execution containers with their state, so as to be reallocated and executed in parallel. This execution model is close to the actors model, as the execution containers are independent and communicate by messages. The communications are assimilated to stream of messages, similarly to the dataflow programming model. It allows to reason on the throughput of these streams, and to react to load increases.

The fluxional execution model executes programs written in our high-level fluxionnal language, whose grammar is presented in figure 1. An application $\langle \text{program} \rangle$ is partitioned into parts encapsulated in autonomous execution containers named $fluxions \langle \text{flx} \rangle$. In the following paragraphs, we present the fluxions. Then we present the messaging system to carry the communications between fluxions. Finally, we present an example application using this execution model.

2.1 Fluxions

A fluxion $\langle \text{flx} \rangle$ is named by a unique identifier $\langle \text{id} \rangle$ to receive messages, and might be part of one or more groups indicated by tags $\langle \text{tags} \rangle$. A fluxion is composed of a processing function $\langle \text{fn} \rangle$, and a local memory called a context $\langle \text{ctx} \rangle$. At a message reception, the fluxion modifies its context, and sends messages on its output streams $\langle \text{streams} \rangle$ to downstream fluxions. The context handles the state on which a fluxion relies between two message receptions. In addition to message passing, the execution model allows fluxions to communicate by sharing state between their contexts. The fluxions that needs to synchronize together are grouped with the same tag, and loose their independence.

There is two types of streams, start and post, which corresponds to the nature of the rupture point yielding the stream. We differentiates the two types with two different arrows, double arrow (\rightarrow or >>) for start rupture points and simple arrow (\rightarrow or ->) for post rupture points. The two dif-

```
\langle flx \rangle \mid \langle flx \rangle \ eol \langle program \rangle
                             flx (id) (tags) (ctx) eol (streams) eol (fn)
                             & (list) | empty string
      (tags)
(streams)
                             null | (stream) | (stream) eol (streams)
                             \langle \text{type} \rangle \langle \text{dest} \rangle [\langle \text{msg} \rangle]
 (stream)
      \langle dest \rangle
                             (list)
                             \{\langle list \rangle\}
        \langle ctx \rangle
                             [\langle list \rangle]
      \langle msg \rangle
        (list)
                              \langle id \rangle \mid \langle id \rangle, \langle list \rangle
                             >> | ->
      (type)
          \langle id \rangle
                             Identifier
                              imperative language and stream syntax
          \langle fn \rangle
```

Figure 1: Syntax of a high-level language to represent a program in the fluxionnal form

ferent type of rupture points are further detailed in section 3.1.1.

2.2 Messaging system

The messaging system assures the stream communications between fluxions. It carries messages based on the names of the recipient fluxions. After the execution of a fluxion, it queues the resulting messages for the event loop to process.

The execution cycle of an example fluxional application is illustrated in figure 2. The source code for this application is in listing 1 and the fluxional code for this application is in listing 2. In figure 2, circles represent registered fluxions. The fluxion reply has a context containing the variable count. The plain arrows represent the actual message paths in the messaging system, while the dashed arrows between fluxions represent the message streams as seen in the fluxionnal application.

The main fluxion is the first fluxion in the flow. It never receives any message, but when the application receives a request, the main fluxion triggers the flow with a start message, ②. This first message is to be received by the next fluxion handler, ③ and ④. The fluxion handler sends back a message, ⑤, to be enqueued, ⑥. The system loops through steps ③ through ⑥ until the queue is empty. This cycle starts again for each new incoming request causing another start message.

2.3 Service example

To illustrate the fluxional execution model, and the compiler, we present an example of a simple web application. This application reads a file, and sends it back along with a request counter.

The original source code of this application is available in listing $1^{\,5}$. In this source code, some points are worth noticing. The handler function, line 5 to 11, receives the input stream of request. The count variable at line 3 increments the request counter. This object needs to be persisted in the fluxion *context*. The template function simply formats the output stream to send back to the client. The app.get and res.send functions, respectively line 5 and 8, interface the application with the clients. And between these two inter-

^{3.} http://githut.info/

^{4.} http://stackoverflow.com/tags

^{5.} The listings are also available on github[3].

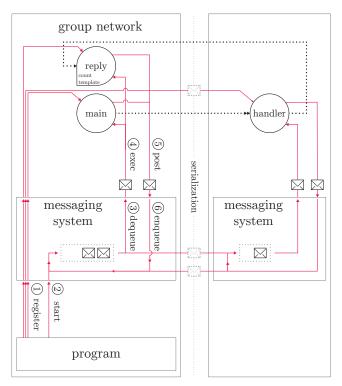


Figure 2: The fluxionnal execution model in details

face functions is a chain of three functions to process the client requests : app.get \rightarrow handler \rightarrow reply.

```
var app = require('express')(),
    fs = require('fs'),
    count = 0;

app.get('/', function handler(req, res){
    fs.readFile(__filename, function reply(err, data) {
        count += 1;
        res.send(err || template(count, data));
    });
};
};

app.listen(8080);
```

Listing 1: Example web application

This application is transformed into the high-level fluxionnal language in listing 2 which is illustred in Figure 2.

The application is organized as follow. The flow of requests is received from the clients by the fluxion main, it continues in the fluxion handler, and finally go through the fluxion reply to be send back to the clients. The fluxions main and reply have the tag network. This tag indicates their dependency over the network interface, because they received the response from and send it back to the clients. The fluxion handler has the tag isolated, it doesn't have any dependencies, hence it can be distributed on an isolated event-loop.

The last fluxion, reply, depends on its context to holds the variable count and the function template. It also depends on the variable res created by the first fluxion, main. This variable is carried by the stream through the chain of fluxion until the fluxion reply that depends on it. This variable holds the references to the network sockets. It is the variable the group network depends on.

Moreover, if the last fluxion, reply, did not had a context,

the group network would be stateless. The whole group could be replicated as many time as needed.

This execution model allows to parallelize the execution of an application. Some parts are arranged in pipeline, like the fluxion handler, some other parts are replicated, like could be the group network. This parallelization improves the scalability of the application. Indeed, as a fluxion contains its state and expresses its dependencies, it can be migrated. It allows to adapt the number of fluxions per core to adjust the resource usage in function of the desired throughput.

Our goal, as described in the introduction, is not to propose a new programming paradigm with this high-level language but to automate the architecture shift. We present the compiler to automate this architecture shift in the next section.

```
flx main & network
   >> handler [res]
     var app = require('express')(),
    fs = require('fs'),
           count = 0;
      app.get('/', >> handler);
      app.listen(8080);
9
   flx handler & isolated
   -> reply [res]
      function handler(req, res) {
        fs.readFile(__filename,
13
                                          reply);
   \textbf{flx reply} \ \& \ network \ \{\texttt{count}, \ \texttt{template}\}
16
   -> null
18
      function reply(error, data) {
        count
        \verb"res.send(err || template(count, data));
```

Listing 2: Example application expressed in the high-level fluxional language

3. FLUXIONNAL COMPILER

The source languages we focus on should present higherorder functions and be implemented as an event-loop with a global memory. Javascript is such a language: it doesn't require an event-loop implementation, but it is often implemented that way. *Node.js* is an example of such an implementation. We developed a compiler that transforms a *Node.js* application into a fluxional application compliant with the execution model described in section 2.

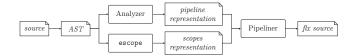


Figure 3: Compilation chain

The chain of compilation is described in figure 3. From the source of a *Node.js* application, the compiler extracts an Abstract Syntax Tree (AST). From this AST, the analyzer step identifies the limits of the different application parts and how they relate to form a pipeline. This first step outputs a pipeline representation of the application. Section 3.1 explains this first compilation step. In the pipeline representation, the stages are not yet independent and encapsulated

into fluxions. From the AST, escope produces a representation of the memory scopes. The pipeliner step analyzes the pipeline representation and the scopes representation to distribute the shared memory into independent groups of fluxions. Section 3.2 explains this second compilation step.

3.1 Analyzer step

The limit between two application parts is defined by a rupture point. The analyzer identifies these rupture points, and outputs a representation of the application in a pipeline form, with application parts as the stages, and rupture points as the message streams of this pipeline.

3.1.1 Rupture points

A rupture point is a call of a loosely coupled function. It is an asynchronous call without subsequent synchronization with the caller. In *Node.js*, I/O operations are asynchronous functions and indicates such rupture point between two application parts. Figure 4 shows an example of a rupture point with the execution of the tow application parts isolated into fluxions. The two application parts are the caller of the asynchronous function call on one hand, and the callback provided to the asynchronous function call on the other hand.

A callback is a function passed as a parameter to a function call. It is invoked by the callee to continue the execution with data not available in the caller context. We distinguish three kinds of callbacks, but only two are asynchronous: listeners and continuations. Similarly, there is two types of rupture points, respectively *start* and *post*.

Start rupture points are indicated by listeners. They are on the border between the application and the outside, continuously receiving incoming user requests. An example of a start rupture point is in listing 1, between the call to app.get(), and its listener handler. These rupture points indicate the input of a data stream in the program, and the beginning of a chain of fluxions to process this stream.

Post rupture points are indicated by continuations. They represent a continuity in the execution flow after an asynchronous operation yielding a unique result, such as reading a file, or querying a database. An example of a post rupture points is in listing 1, between the call to fs.readFile(), and its continuation reply.

3.1.2 Detection

The compiler uses a list of common asynchronous callee, like the express and file system methods. This list can be augmented to match asynchronous callee individually for any application. To identify the callee, the analyzer walks the AST to find a call expression matching this list.

After the identification of the callee, the callback needs to be identified as well to be encapsulated in the downstream fluxion. For each asynchronous call detected, the compiler test if one of the arguments is of type function. Some callback functions are declared *in situ*, and are trivially detected. For variable identifier, and other expressions, the analyzer tries to detect their type. To do so, the analyzer walks back the AST to track their assignations and modifications, and determine their last value.

3.2 Pipeliner step

A rupture point eventually breaks the chain of scopes between the upstream and downstream fluxion. The closure

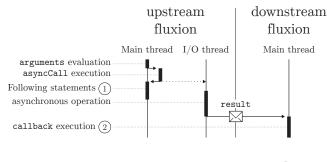


Figure 4: Rupture point interface

in the downstream fluxion cannot access the scope in the upstream fluxion as expected. The pipeliner step replaces the need for this closure, allowing application parts to rely only on independent memory stores and message passing. It determines the distribution using the scope representation, which represents the variables dependencies between application parts. Depending on this representation, there is three different ways the compiler can replace the broken closure. We present these three alternative with the example figure 5.

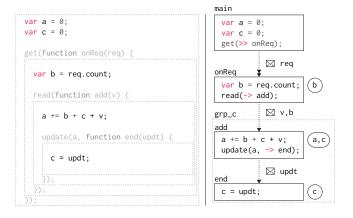


Figure 5: Example of different usage of variables in Javascript (left) and the equivalence in the Fluxion-nal representation (right).

Scope.

If a variable is modified inside only one application part in the current *post* chain, then the pipeliner adds it the context of its fluxion.

In figure 5, the variable a is updated in the function add. The pipeliner steps store this variable in the context of the fluxion add.

Stream.

If a variable is modified inside an application part, and read inside downstream application parts, then the pipeliner makes the upstreap fluxion add this variable to the message stream to be sent to the downstream fluxions. It is impossible to send variables to upstream fluxions, without race conditions. If the fluxion retro propagates the variable for an upstream fluxion to read, the upstream fluxion might use the old version while the new version is on its way.

In figure 5, the variable b is set in the function onReq, and read in the function add. The pipeliner steps makes the fluxion onReq send the updated variable b, in addition to the variable v, in the message sent to the fluxion add.

Exceptionally, if a variable is defined inside a *post* chain, then this variable can be streamed inside this *post* chain without restriction on the order of modification and read. Indeed, the execution of the upstream fluxion for the current *post* chain is assured to end before the execution of the downstream fluxion. Therefore, no read of the variable by the upstream fluxion happen after the modification by the downstream fluxion. The variable b is such a variable.

Share.

If a variable is needed for modification by several application parts, or is read by an upstream application part, then it needs to be synchronized between the fluxions. The synchronization of a distributed memory is a well-known subject starting with the BASE semantics[6]. To respect the semantics of the source application, we cannot tolerate inconsistencies. Therefore, the pipeliner groups all the fluxions sharing this variable within a same tag. And it adds this variable to the contexts of each fluxions.

In figure 5, the variable c is set in the function end, and read in the function add. As the fluxion add is upstream of end, the pipeliner steps groups the fluxion add and end with the tag grp_c to allow the two fluxions to share this variable.

4. EVALUATION

The goal of this evaluation is to prove the possibility for an application to be compiled in order to defer parts of its execution on a remote worker. We want to show the limitations of this isolation for future works, and the modifications needed to circumvent these limitations.

For brevity, we present in this paper only one test on a real application, gifsockets-server 6 . We chosed it because it is a working application, simple enough to illustrate this evaluation.

This application is an example of a chat using gif-based communication channels. The client, a page containing a never-ending gif, sends a request containing a text typed by the user. The server transforms this text into a gif frame, and pushes this frame back to the never-ending gif to be displayed. Listing 3 is a simplified version of this application, containing only critical sections.

The web application framework used in this application, express, allows to register chains of functions to process user requests. On line 25, the call to app.post register two functions to process the requests on the url /image/text. The closure saveBody, line 7, returned by bodyParser, line 6, and the method routes.writeTextToImages from the external module gifsockets-middleware, line 3. The closure saveBody gather the whole request, and let express call the next function in the chain, routes.writeTextToImages, by calling next, line 20.

```
var express = require('express'),
app = express().
```

```
routes = require('gifsockets-middleware');
       getRawBody = require('raw-body');
   function bodyParser(limit) {
     return function saveBody(req, res, next) {
       getRawBody(req,
         expected: req.headers['content-length'],
         limit: limit
       }, function (err, buffer)
11
         % if (err) {
             res.writeHead(500,
               'content-type': 'text/plain'
             return res.end('Content was too long');
        % }
18
         rea.bodv = buffer:
19
        next();
23
24
  app.post('/image/text', bodyParser(1 * 1024 * 1024),
25
        routes.writeTextToImages);
  app.listen(8000):
```

Listing 3: Simplified version of gifsockets-server

4.1 Compilation

We compile this application with the compiler detailed in section 3. The function call app.post, line 25, is asynchronous. Its callbacks, bodyParser and routes.writeTextToImages are evaluated at runtime. For this reason, the compiler is currently unable to detect them as functions. For future works, we intend to improve the compiler with a runtime part, to detect callbacks dynamically evaluated.

The compilation result is in listing 4. The compiler detects a rupture point : the asynchronous function getRawBody and its anonymous callback, line 11. It encapsulates this callback in a fluxion named anonymous_1000. The original callback is replaced with a placeholder to send a message to this downstream fluxion.

The compiler identifies that this callback uses the variables req, and next. It puts these variables in the stream of the message to send to the downstream fluxion anonymous-1000.

When anonymous_1000 is not isolated from the main fluxion, as if they shared a tag, the compilation result works as expected. The variables used in the fluxion, req, res and next, are still shared between the two fluxions. Our goal is to isolate the two, to be able to safely parallelize their executions.

^{6.} https://github.com/twolfson/gifsockets-server

Listing 4: Compilation result of the simplified version of gifsockets-server

4.2 Isolation

The fluxion anonymous_1000 requires access over the variables req and next. In listing 4, it modifies the attribute body of the object req, line 30, to store the text of the received request. It calls next to continue the execution, line 31. These variables points to closures. Our messaging system is currently unable to serialize closures to send them to fluxion anonymous_1000. Therefore, isolating the fluxion anonymous_1000 produces runtime exceptions because it lacks access to these closures. We detail in the next paragraph, how the compiler handles this situation.

4.2.1 Variable req

The variable req is read in fluxion main, lines 10 and ??. Then it is modified in fluxion anonymous_1000, line 30. According to the compiler, this variable is never used after, and its scope ends at the end of the anonymous callback function. However, the side effect of this modification impact the shared memory, and the next callback, routes.writeTextToImages.

TODO continue

4.2.2 Closure next

The function next is a closure over the *express* Router. This function is provided by the Router itself to allow one function in the chain to call the next. It is impossible to send this closure to the isolated fluxion. Instead, we modify *express*, so as to be compatible with the fluxionnal execution model.

The req, res and next objects needs to stay on the master worker to preserve their closures. The *express* Router register a local fluxion named express_dispatcher to holds these objects on the master worker, and receives the result of the isolated fluxion anonymous_1000. The application sends the original object to the fluxion express_dispatcher and serialized copies to the isolated fluxion anonymous_1000. In this latter fluxion, the anonymous callback do its computation; it assigns the received body as an attribute of req.

In the original application, the anonymous callback finishes by calling the function next to let the Router call the next function to process the request. In the compiled application, this function next is not available on the isolated worker. Instead, the anonymous callback inside anonymous_1000 calls a function next specially provided by the fluxionnal execution model to send a message to the fluxion express_dispatcher with the modified copies of req and res.

In the original application, *express* relies on side-effects on the objects req and res to get their modifications. The call to next doesn't need them as argument. In the isolated fluxion, as the serialized object and their originals are

isolated from each other, side-effects don't propagate. The special next function needs explicit references to the modified objects to send them back to express_dispatcher. The fluxion express_dispatcher then merges back the modified copies and their originals, before calling the original function next.

After the modifications detailed above, the server works as expected for the subset of functionalities we modified. The isolated fluxion correctly receives, and returns its serialized messages. The client successfully receives a gif frame containing the text. However, in this evaluation, we ignored the case of error.

5. RELATED WORKS

The idea to split a task into independent parts goes back to the Actor's model [7] in 1973, and to Functional programming, like Lucid [2] in 1977 and all the following works on DataFlow leading up to Flow-Based programming (FBP) and Functional Reactive Programming (FRP). Both FBP and FRP, recently got some attention in the Javascript community with the projects NoFlo⁷, Bacon.js⁸ and react⁹.

The execution model we presented in section 2, is inspired by some works on scalability for very large system, like the Staged Event-Driven Architecture (SEDA) by Matt Welsh [16], System S developped in the IBM T. J. Watson research center [8, 17], and later the MapReduce architecture [4]. It also drew its inspiration from more recent work following SEDA. Among the best-known following works, we cited in the introduction Spark [18, 19], MillWheel [1], Timestream [13] and Storm [14]. The first part of our work stands upon these thorough studies. However, we believe that it is too difficult for most developers to distribute the state of an application. This belief motivated us to propose a compiler from an imparative programming model to these more scalable, distributed execution engines.

The transformation of an imperative programming model to be executed onto a parallel execution engine was recently addressed by Fernandez et. al. [5]. However, like in similar works [11, 12], the developers need to annotate their code to specify the distribution of state. It doesn't improve the accessibility of these distributed execution engines. Our approach avoids the need for annotations from the developer, thus aims at improving furthermore the accessibility.

Most approaches of imperative code transformation for parallelization focus on parallelizing loops in a sequential program. TODO citation? Because of this sequential structure, the speedup of parallelization is inherently limited. On the other hand, our approach is based on an asynchronous programming model, discarding this sequential structure. Hence the attainable speedup is not limited by sequential structure.

Our compiler uses the *estools* suite to parse, manipulate and generate source code from Abstract Syntax Tree (AST) 10 . It modifies AST, as described in [9]. The implementation of the analyzer might be inspired from the points-to analysis in future works [15]. Our implementation is based on the work by Ryan Dahl: *Node.js* 11 , as well as on one of

^{7.} http://noflojs.org/

^{8.} https://baconjs.github.io/

^{9.} https://facebook.github.io/react/

 $^{10.\ \}mathsf{https://github.com/estools}$

^{11.} https://nodejs.org/

the best-known Node.js web framework : Express ¹².

6. CONCLUSION

In this paper, we presented our work on a high-level language allowing to represent a web application as a network of independent parts communicating by message streams. We presented a compiler to transform a Node.js web application into this high-level representation. To identify two independent parts, the compiler spots rupture points in the application, possibly leading to memory isolation and thus, parallelism. The compiler is still in early development, and is unable to soundly distribute memory. However, we proved it is possible to compile an application so that parts of its execution are parallelized, with minimum helps from the developer - only to identify the asynchronous calls. We also presented the execution model to operate an application expressed in our high-level language. This distributed approach allows code-mobility which may lead to a better scalability. We believe this high-level approach can enable the scalability required by highly concurrent web applications without discarding the familiar monolithic and asynchronous programming model used in *Node.js*.

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