# Augmented Reality Library for the Web (tracking.js)

by

Eduardo A. Lundgren Melo

Submitted to the Center for Informatics in partial fulfillment of the requirements for the degree of

Master of Science in Computer Science

at the

#### FEDERAL UNIVERSITY OF PERNAMBUCO

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#### Abstract

In this thesis, I designed and implemented an Augmented Reality (AR) framework aiming to provide a common infrastructure to develop applications and to accelerate the use of those techniques on the web in commercial products. It runs on native web browsers without requiring third-party plugins installation. This involves the use of several modern browser specifications as well as implementation of different computer vision algorithms and techniques into the browser environment. These algorithms can be used to detect and recognize faces, identify objects, track moving objects, etc. The source language of the framework is JavaScript that is the language interpreted by all modern browsers. The majority of interpreted languages have limited computational power when compared to compiled languages, such as C. The computational complexity involved in AR requires highly optimized implementations. Some optimizations are discussed and implemented on this work in order to achieve good results when compared with similar implementations in compiled languages. A series of evaluation tests were made, to determine how effective these techniques were on the web.

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## Acknowledgments

This is the acknowledgements section. You should replace this with your own acknowledgements [1] foo [1].

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# Contents

Li	List of Acronyms		15
1	Inti	oduction	17
	1.1	Motivation	18
	1.2	Problem Definition	18
	1.3	Objectives	18
		1.3.1 Augmented Reality Library for the Web	19
	1.4	Thesis Structure	19
2	Bas	ic Concepts	21
	2.1	Web	21
		2.1.1 State of the Art	22
		2.1.2 Problems of Augmented Reality on the Web	24
	2.2	Augmented Reality	24
		2.2.1 State of the Art	24
	2.3	Tracking and Object Detection	24
		2.3.1 State of the Art	24
3	Aug	gmented Reality Library for the Web (tracking.js)	25
	3.1	Introduction	25
	3.2	Color Tracking Algorithm	25
	3.3	Marker-less Tracking Algorithm (Keypoints)	26
	3.4	Rapid Object Detection and Tracking Algorithm	26

4	Eva	Evaluation	
	4.1	Tools	27
	4.2	Scenario Description	27
	4.3	Evaluation Methodology	28
		4.3.1 Matching Robustness	28
		4.3.2 Oclusion Robustness	28
		4.3.3 FPS	28
	4.4	Results	28
۲	Con	nclusion	20
9	Con	ICIUSIOII	29
	5.1	Contributions	29
	5.2	Future Work	29

# List of Figures

2-1 Reference architecture for web browsers	2
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# List of Tables

# List of Acronyms

AJAX Asynchronous JavaScript and XML

**BAST** Bug Report Analysis and Search Tool

**BTT** Bug Report Tracker Tool

**BRN** Bug Report Network

**CCB** Change Control Board

#### Introduction

This section introduces this master thesis. It will briefly describe the motivation of the work itself, state the problem that we will focus on solving and shortly discuss the proposed solution. In the end, explain the structure of the next chapters.

Micro-optimization is a technique to reduce the overall operation count of floating point operations. In a standard floating point unit, floating point operations are fairly high level, such as "multiply" and "add"; in a micro floating point unit ( $\mu$ FPU), these have been broken down into their constituent low-level floating point operations on the mantissas and exponents of the floating point numbers.

Chapter two describes the architecture of the  $\mu$ FPU unit, and the motivations for the design decisions made.

Chapter three describes the design of the compiler, as well as how the optimizations discussed in section 1 were implemented.

Chapter four describes the purpose of test code that was compiled, and which statistics were gathered by running it through the simulator. The purpose is to measure what effect the micro-optimizations had, compared to unoptimized code. Possible future expansions to the project are also discussed.

#### 1.1 Motivation

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Augmented Reality, Tracking and Detection, Web, Tracking on the Web

#### 1.2 Problem Definition

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#### 1.3 Objectives

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#### 1.3.1 Augmented Reality Library for the Web

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#### 1.4 Thesis Structure

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# **Basic Concepts**

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#### 2.1 Web

Using concepts from existing hypertext systems, Tim Berners-Lee, computer scientist and at that time employee of CERN, wrote a proposal in March 1989 for what would eventually become the World Wide Web (WWW) [3].

The World Wide Web is a shared information system operating on top of the Internet. Web browsers retrieve content and display from remote web servers using a stateless and anonymous protocol called HyperText Transfer Protocol (HTTP). Web pages are written using a simple language called HyperText Markup Language (HTML). They may be augmented with other technologies such as Cascading Style Sheets (CSS), which adds additional layout and style information to the page, and JavaScript language, which allows client-side computation. Browsers typically provide other useful features such as bookmarking, history, password management, and

accessibility features to accommodate users with disabilities [1].

In the beginning of the web, plain text and images were the most advanced features available on the browsers. In 1994, the World Wide Web Consortium (W3C) was founded to promote interoperability among web technologies. Companies behind web browser development together with the web community, were able to contribute to the W3C specifications [3]. Today's web is a result of the ongoing efforts of an open web community that helps define these technologies and ensure that they're supported in all web browsers. Those contributions transformed the web in a growing universe of interlinked pages and applications, with videos, photos, interactive content, 3D graphics processed by the Graphics Processing Unit (GPU), and other varieties of features without requiring any third-party plugins installation [2]. The significant reuse of open source components among different browsers and the emergence of extensive web standards have caused the browsers to exhibit "convergent evolution" [1].

#### 2.1.1 State of the Art

The browser main functionality is to present a web resource, by requesting it from the server and displaying it on the browser window. There are four major browsers used today: Internet Explorer, Firefox, Safari and Chrome. Currently, the usage share of Firefox, Safari and Chrome together is nearly 60%.

Two mature browser implementations were selected and, for each browser, a conceptual architecture was described based on domain knowledge and available documentation. Firefox and Chrome were used to derive the reference architecture because they are mature systems, have reasonably large developer communities and user bases, provide good support for web standards, and are entirely open source.

The reference architecture for web browsers based on two well known open source implementations architecture is shown in Figure 2-1; it comprises eight major subsystems plus the dependencies between them: (1) the User Interface, this includes the address bar, back and forward buttons, bookmarking menu etc. Every part of the browser display except the main window where you see the requested resource;

(2) the Browser Engine, an embeddable component that provides a high-level interface for querying and manipulating the Rendering Engine; (3) the Rendering Engine, which performs parsing and layout for HTML documents, optionally styled with CSS; (4) the Networking subsystem, used for network calls, like HTTP requests. It has platform independent interface and underneath implementations for each platform; (5) the JavaScript Interpreter, used to parse and execute the JavaScript code; (6) the XML Parser; (7) the UI Backend, which provides drawing and windowing primitives, user interface widgets, and fonts. Underneath it uses the operating system user interface methods; and (8) the Data Persistence subsystem, which stores various data associated with the browsing session on disk, including bookmarks, cookies, and cache [1].

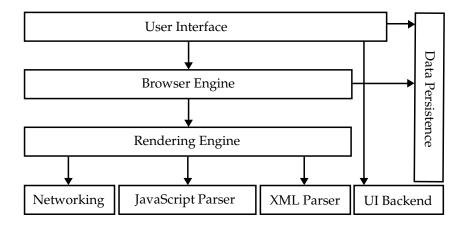


Figure 2-1: Reference architecture for web browsers

Browser subsystem are swappable and could vary for browser vendor, platform or operational system. The browsers mostly differ in subsystems (2) the Browser Engine, (3) the Rendering Engine, and (5) the JavaScript Interpreter. Firefox subsystems (2) and (3) is known as Gecko, Safari as Webkit and Chrome uses a fork of Webkit called Blink.

#### 2.1.2 Problems of Augmented Reality on the Web

#### 2.2 Augmented Reality

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#### 2.2.1 State of the Art

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#### 2.3 Tracking and Object Detection

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#### 2.3.1 State of the Art

# Augmented Reality Library for the Web (tracking.js)

#### 3.1 Introduction

Supported modules: color, keypoints, rapid object detection.

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#### 3.2 Color Tracking Algorithm

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#### 3.3 Marker-less Tracking Algorithm (Keypoints)

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BRIEF, FAST, RANSAC.

# 3.4 Rapid Object Detection and Tracking Algorithm

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Viola-Jones: Features, Integral images, Learning, Detection, Training a cascade of classifiers, Training data optimization for JavaScript.

#### **Evaluation**

#### 4.1 Tools

OpenCV, JSFlartoolkit, Others. Lorem ipsum dolor sit amet, consectetur adipisicing elit, sed do eiusmod tempor incididunt ut labore et dolore magna aliqua. Ut enim ad minim veniam, quis nostrud exercitation ullamco laboris nisi ut aliquip ex ea commodo consequat. Duis aute irure dolor in reprehenderit in voluptate velit esse cillum dolore eu fugiat nulla pariatur. Excepteur sint occaecat cupidatat non proident, sunt in culpa qui officia deserunt mollit anim id est laborum.

#### 4.2 Scenario Description

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#### 4.3 Evaluation Methodology

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#### 4.3.1 Matching Robustness

#### 4.3.2 Oclusion Robustness

#### 4.3.3 FPS

#### 4.4 Results

Graphics, Analysys. Lorem ipsum dolor sit amet, consectetur adipisicing elit, sed do eiusmod tempor incididunt ut labore et dolore magna aliqua. Ut enim ad minim veniam, quis nostrud exercitation ullamco laboris nisi ut aliquip ex ea commodo consequat. Duis aute irure dolor in reprehenderit in voluptate velit esse cillum dolore eu fugiat nulla pariatur. Excepteur sint occaecat cupidatat non proident, sunt in culpa qui officia deserunt mollit anim id est laborum.

### Conclusion

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#### 5.1 Contributions

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#### 5.2 Future Work

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exercitation ullamco laboris nisi ut aliquip ex ea commodo consequat. Duis aute irure dolor in reprehenderit in voluptate velit esse cillum dolore eu fugiat nulla pariatur. Excepteur sint occaecat cupidatat non proident, sunt in culpa qui officia deserunt mollit anim id est laborum.

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