ALMA MATER STUDIORUM – UNIVERSITÀ DI BOLOGNA

Corso di Laurea Magistrale in Ingegneria e Scienze Informatiche

Addressing Fairness in AI Systems: Design and Development of a Pragmatic (Meta-)Methodology

Tesi di laurea in:
Intelligent Systems Engineering

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Abstract

Max 2000 characters, strict.

Optional. Max a few lines.

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Chapter 1

Introduction

Write your intro here.

Mattia Matteini: Add sidenotes in this way. They are named after the author of the thesis

You can use acronyms that your defined previously, such as cro:IoTInternet of Thing (IoT). If you use acronyms twice, they will be written in full only once (indeed, you can mention the IoT now without it being fully explained). In some cases, you may need a plural form of the acronym. For instance, that you are discussing cro:vmVirtual Machines (VMs), you may need both VM and VMs.

Structure of the Thesis

Mattia Matteini: At the end, describe the structure of the paper

Chapter 2

Background

2.1 AI Lifecycle

2.2 Practical Issues

I suggest referencing stuff as follows: fig. 2.1 or Figure 2.1

You may also put some code snippet (which is NOT float by default), eg: section 2.2.

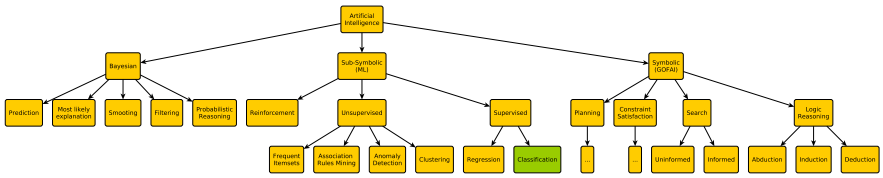

Figure 2.1: Some random image

```
public class HelloWorld {
  public static void main(String[] args) {
    // Prints "Hello, World" to the terminal window.
    System.out.println("Hello, World");
  }
}
```

Chapter 3

The Meta-Methodology

3.1 The Roles(?)

3.2 The Q/A Mechanism

Chapter 4

Design

4.1 Architecture

Chapter 5

Implementation

Chapter 6

Conclusions

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