

Synchronous Artificial Neural Networks with Runtime Enforcement for Safety Critical Systems

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Overview

Introduction

Background

Existing Solutions for Safety-Critical AI Systems

Solution: Utilising Synchronous Semantics

Results

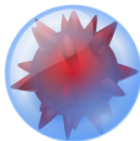
What is Artificial Intelligence? [1]

The aim for machines to intelligently decide the best course of action to meet their respective goals.

Machine-based...

- ▶ Acquisition and Manipulation of Knowledge
- ▶ Generation and Achievement of Goals

Are they useful?



Security



Finance



Analytics



Banking



Automotive

Image/Pattern Recognition

There are many kinds of AI

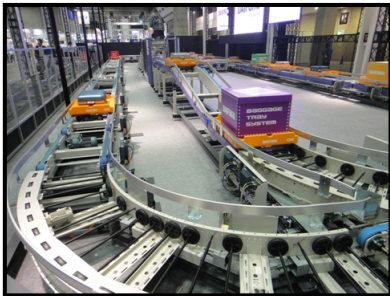
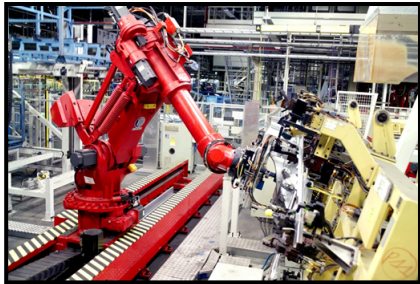
(Some) Types

- ▶ Symbolic AI
- ▶ Statistical Learning
- ▶ Sub-symbolic
 - ▶ Evolutionary Computation
 - ▶ Probabilistic Modelling
 - ▶ **Neural Networks**

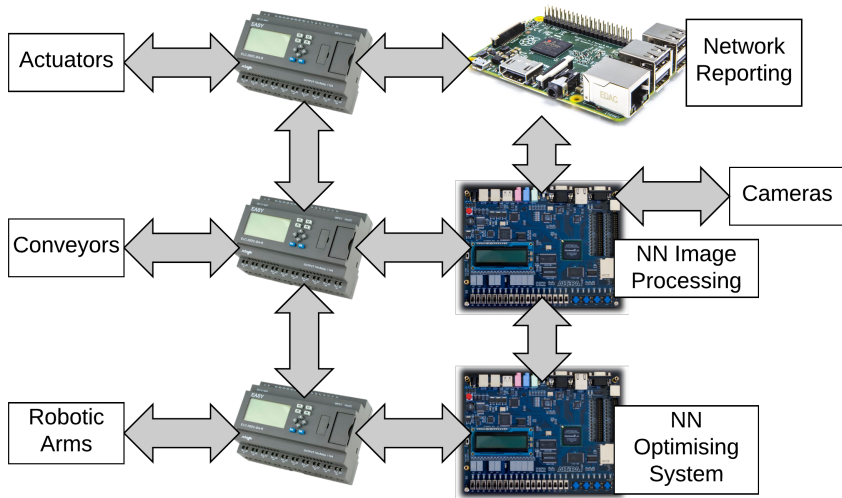
AI is *reactive*...



Reactive Safety-Critical Systems



AI Controllers?



The Problem: Post-verified ANNs for safety critical systems

Safety critical ANNs

- ▶ Software / Systems based on ML can be very complex.
- ▶ Not suitable for safety critical systems without validation/verification.
- ▶ Existing techniques to verify/validate ANNs for safety critical environments (proactive): not always ideal.
- ▶ Few solutions for *reactive* safety critical ANNs.
- ▶ When is an ANN *safe* to use?
- ▶ Functional Analysis?
- ▶ **Runtime Enforcement** (reactive)?

A formal approach for **reactive** safety-critical AI systems

- ▶ Synchronous semantics
 - ▶ Similar Capture/Process/Emit lifecycle
- ▶ Compositionality
- ▶ **Synchronous Runtime Enforcement**

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A brief overview of ML

- ▶ Make programs that learn from data without being explicitly programmed to do so
- ▶
 - ▶ Decision trees
 - ▶ **Neural Networks - deep learning**
 - ▶ Reinforcement learning

A brief overview of NN

- ▶ Type of machine learning
- ▶ Originally designed to model the brain
- ▶ One neural network is a group of interconnected nodes, called artificial neurons, which pass signals among themselves
- ▶ Many different network structures
- ▶ Many different ways to allow neural networks to learn

Why are Current Implementations bad?

Complicating Static Analysis

- ▶ Not verified for safety-critical systems.
- ▶ Difficult to quantify an ANN.
- ▶ How to make ANNs safe?

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Current AI in safety-critical applications

- ▶ Process to determine ANN safety during creation - validation/verification.
 - ▶ Unit testing
 - ▶ Rule extraction
 - ▶ Strict guidelines
- ▶ Safety Critical Artificial Neural Networks (SCANNs)
 - ▶ Fuzzy Self-Organising Maps (FSOMs)
 - ▶ Rule extraction + insertion
 - ▶ Safety cases

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Introduction to Synchronous Semantics

- ▶ No chance of deadlocks occurring during runtime.
- ▶ Loops are bounded.
- ▶ Causality is maintained.
- ▶ Resource use is monitored.
- ▶ Consistent function output.
- ▶ **Runtime enforcement**
- ▶ Easier to analyse WCET.

Runtime Enforcement

- ▶ Input-to-output functions
- ▶ Input/output checking
- ▶ Training guiding
- ▶ Inter-layer enforcement

Running example: ?

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References

- [1] A. Sloman, "What is artificial intelligence?," *The University of Birmingham, Computer Science Department (junio, 9, 1998)*. <http://www.cs.bham.ac.uk/~axs/misc/oxford/whatsai.openday.pdf>, 1998.

Source code access