

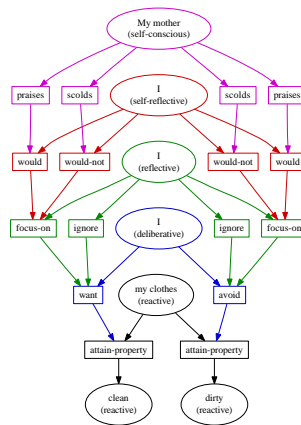
BO MORGAN

A REFLECTIVE COGNITIVE ARCHITECTURE  
FOR COMBINING A VARIETY OF WAYS OF  
LEARNING



# A REFLECTIVE COGNITIVE ARCHITECTURE FOR COMBINING A VARIETY OF WAYS OF LEARNING

BO MORGAN



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Don't do anything that isn't play.

— Joseph Campbell

Dedicated to the loving memory of Push Singh.

1972 – 2006



## ABSTRACT

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Recently, there have been two directions of research with the goal of building a machine that explains intelligent human behavior. The first approach is to build a baby-machine that learns from scratch to accomplish goals through interactions with its environment. The second approach is to give the machine an abundance of knowledge that represents correct behavior.

Each of these solutions has benefits and drawbacks. The baby-machine approach is good for dealing with novel problems, but these problems are necessarily simple because complex problems require a lot of background knowledge. The data abundance approach deals well with complicated problems requiring a lot of background knowledge, but fails to adapt to changing environments, for which the algorithm has not already been trained.

We are working on an algorithm that benefits from both of these approaches by learning from cultural language knowledge, while reflectively monitoring and recognizing the failures of this knowledge when it is used in a goal-oriented domain.

Toward this end we have developed a reflective programming language allowing us the ability to monitor the execution and interactions between large numbers of complicated lisp-like processes. Further, we have developed a cognitive architecture within our language that provides structures for layering reflective processes, resulting in a hierarchy of control algorithms that respond to failures in the layers below.

Finally, we present an example of our cognitive architecture learning in the context of a social commonsense reasoning domain with parents that teach children as they attempt to accomplish cooking tasks in a kitchen.





## PUBLICATIONS

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Some ideas and figures have appeared previously in the following publications:

Smith, D. and Morgan, B.; "IsisWorld: An open source commonsense simulator for AI researchers"; AAAI 2010 Workshop on Metacognition; 2010 April

Morgan, B.; "A Computational Theory of the Communication of Problem Solving Knowledge between Parents and Children"; PhD Proposal; MIT Media Lab 2010 January

Morgan, B.; "Funk2: A Distributed Processing Language for Reflective Tracing of a Large Critic-Selector Cognitive Architecture"; Proceedings of the Metacognition Workshop at the Third IEEE International Conference on Self-Adaptive and Self-Organizing Systems; San Francisco, California, USA; 2009 September

Morgan, B.; "Funk2: A Frame-based Programming Language with Causally Reflective Capabilities (draft in progress)"; Technical Note; Massachusetts Institute of Technology; 2009 May

Morgan, B.; "Learning Commonsense Human-language Descriptions from Temporal and Spatial Sensor-network Data"; Masters Thesis; Massachusetts Institute of Technology; 2006 August

Morgan, B.; "Learning perception lattices to compare generative explanations of human-language stories"; Published Online; Commonsense Tech Note; MIT Media Lab; 2006 July

Morgan, B. and Singh, P.; "Elaborating Sensor Data using Temporal and Spatial Commonsense Reasoning"; International Workshop on Wearable and Implantable Body Sensor Networks (BSN-2006); 2005 November

Morgan, B.; "Experts think together to solve hard problems"; Published Online; Commonsense Tech Note; MIT Media Lab 2005 August

Morgan, B.; "LifeNet Belief Propagation"; Published Online; Commonsense Tech Note; MIT Media Lab; 2004 January



*Though there be no such thing as Chance in the world;  
our ignorance of the real cause of any event  
has the same influence on the understanding,  
and begets a like species of belief or opinion.*

— David Hume [2]

## ACKNOWLEDGMENTS

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Put your acknowledgments here.



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Part I

THE SOCIAL COMMONSENSE LEARNING  
PROBLEM



## INTRODUCTION

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Problem-solvers must find relevant data. How does the human mind retrieve what it needs from among so many millions of knowledge items? Different AI systems have attempted to use a variety of different methods for this. Some assign keywords, attributes, or descriptors to each item and then locate data by feature-matching or by using more sophisticated associative data-base methods. Others use graph-matching or analogical case-based adaptation. Yet others try to find relevant information by threading their ways through systematic, usually hierarchical classifications of knowledge—sometimes called “ontologies”. But, to me, all such ideas seem deficient because it is not enough to classify items of information simply in terms of the features or structures of those items themselves. This is because we rarely use a representation in an intentional vacuum, but we always have goals—and two objects may seem similar for one purpose but different for another purpose.

— Marvin Minsky [3]

### 1.1 COMMONSENSE REASONING



## Part II

### REFLECTIVE LAYERS OF GOALS, LEARNING, AND KNOWLEDGE



## INTRODUCTION

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In this chapter we will describe a sequence of scenarios that will demonstrate the top three layers of our theory: (1) reflective, (2) self-reflective, and (3) self-conscious.

First, we will describe examples critics and selectors in the top layers of our model.

### 2.1 BASIC FORMS OF FAILURE MUST BE DEBUGGED

A plan to use a resource is executed and that resource is no longer available when that step is about to be executed. This could be due to a number of types of reasons:

World Model Failure: The model of the world was incorrect. Miscategorized preconditions and postconditions for an action.

Planning Failure: The plan was incorrect. The agent had the correct knowledge regarding the actions involved in the plan, but the knowledge was not used when the plan was created.

- Control of Planning Failure:

### 2.2 SELF-CONSCIOUS REFLECTION

Self-conscious reflective critics look for conflicts between self- and other-models in stories and select resources that can debug those types of conflicts.

For example, when a person plans to use a resource and then another person uses that resource.





### Part III

## A PROGRAMMING LANGUAGE FOR SIMULATING A VARIETY OF REFLECTIVE THOUGHT PROCESSES



Part IV

A COGNITIVE ARCHITECTURE FOR  
COORDINATING A VARIETY OF WAYS OF  
LEARNING



EXAMPLES

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Part V

AN EXAMPLE OF A SOCIAL  
COMMONSENSE REASONING DOMAIN  
INVOLVING MULTIPLE WAYS OF  
LEARNING





Ei choro aeterno antiopam mea, labitur bonorum pri no. His no decore nemore graecis. In eos meis nominavi, liber soluta vim cu. Sea commune suavitate interpretaris eu, vix eu libris efficiantur.

#### 4.1 SOME FORMULAS

Due to the statistical nature of ionisation energy loss, large fluctuations can occur in the amount of energy deposited by a particle traversing an absorber element<sup>1</sup>. Continuous processes such as multiple scattering and energy loss play a relevant role in the longitudinal and lateral development of electromagnetic and hadronic showers, and in the case of sampling calorimeters the measured resolution can be significantly affected by such fluctuations in their active layers. The description of ionisation fluctuations is characterised by the significance parameter  $\kappa$ , which is proportional to the ratio of mean energy loss to the maximum allowed energy transfer in a single collision with an atomic electron:

$$\kappa = \frac{\xi}{E_{\max}} ZNR$$

$E_{\max}$  is the maximum transferable energy in a single collision with an atomic electron.

$$E_{\max} = \frac{2m_e\beta^2\gamma^2}{1 + 2\gamma m_e/m_x + (m_e/m_x)^2},$$

where  $\gamma = E/m_x$ ,  $E$  is energy and  $m_x$  the mass of the incident particle,  $\beta^2 = 1 - 1/\gamma^2$  and  $m_e$  is the electron mass.  $\xi$  comes from the Rutherford scattering cross section and is defined as:

$$\xi = \frac{2\pi z^2 e^4 N_{Av} Z \rho \delta x}{m_e \beta^2 c^2 A} = 153.4 \frac{z^2}{\beta^2} \frac{Z}{A} \rho \delta x \quad \text{keV},$$

where

- $z$  charge of the incident particle
- $N_{Av}$  Avogadro's number
- $Z$  atomic number of the material
- $A$  atomic weight of the material
- $\rho$  density
- $\delta x$  thickness of the material

$\kappa$  measures the contribution of the collisions with energy transfer close to  $E_{\max}$ . For a given absorber,  $\kappa$  tends towards large values if  $\delta x$  is large and/or if  $\beta$  is small. Likewise,  $\kappa$  tends towards zero if  $\delta x$  is small and/or if  $\beta$  approaches 1.

*You might get unexpected results using math in chapter or section heads. Consider the pdfspacing option.*

<sup>1</sup> Examples taken from Walter Schmidt's great gallery:  
<http://home.vrweb.de/~was/mathfonts.html>

The value of  $\kappa$  distinguishes two regimes which occur in the description of ionisation fluctuations:

1. A large number of collisions involving the loss of all or most of the incident particle energy during the traversal of an absorber.

As the total energy transfer is composed of a multitude of small energy losses, we can apply the central limit theorem and describe the fluctuations by a Gaussian distribution. This case is applicable to non-relativistic particles and is described by the inequality  $\kappa > 10$  (i.e., when the mean energy loss in the absorber is greater than the maximum energy transfer in a single collision).

2. Particles traversing thin counters and incident electrons under any conditions.

The relevant inequalities and distributions are  $0.01 < \kappa < 10$ , Vavilov distribution, and  $\kappa < 0.01$ , Landau distribution.

#### 4.2 VARIOUS MATHEMATICAL EXAMPLES

If  $n > 2$ , the identity

$$t[u_1, \dots, u_n] = t[t[u_1, \dots, u_{n-1}], t[u_n, \dots, u_n]]$$

defines  $t[u_1, \dots, u_n]$  recursively, and it can be shown that the alternative definition

$$t[u_1, \dots, u_n] = t[t[u_1, u_2], \dots, t[u_{n-1}, u_n]]$$

gives the same result.

## Part VI

# CONCLUSIONS AND FUTURE DIRECTIONS



Part VII

APPENDIX





## RELATED PHILOSOPHY

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“Being and Time: the verb-gerund relationship”

“The intensional stance”





RELATED RESEARCH IN PSYCHOLOGY

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Between the ages of 1-3 years old, children display primary emotions, such as joy, disappointment, and surprise. These emotional processes have been hypothesized to be related to the process of failing or succeeding to accomplish a goal. Around age 4, children begin to display emotions that involve the self, such as guilt and shame. It has been hypothesized that these emotions relate to another person's evaluation of the child's goals as good or bad.

We approach modelling this developmental process by applying Marvin Minsky's theory of the child-imprimer relationship. According to Minsky's theory, at a young age, a human child becomes attached to a person that functions as a teacher. The imprimer could be a parent or a caregiver or another person in the child's life, but the function of the imprimer is to provide feedback to the child in terms of what goals are good or bad for the child to pursue.

**B.1 SIMULATION THEORY OF MIND VERSUS THEORY THEORY OF MIND****B.2 EMOTION OR AFFECT VERSUS GOAL-ORIENTED COGNITION****B.3 EMBARRASSMENT, GUILT, AND SHAME**



## RELATED RESEARCH IN NEUROSCIENCE

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C.1 NEURAL CORRELATES OF CONSCIOUSNESS

C.2 LEARNING BY POSITIVE AND NEGATIVE REINFORCEMENT



## RELATED RESEARCH IN ARTIFICIAL INTELLIGENCE

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### D.1 INFERENCE, PLANNING, AND MACHINE LEARNING ARE ALL PARTIAL SOLUTIONS

“These systems use multiple representations including semantic networks, propositional and first-order probabilistic graphical models, case bases of story scripts, rule based systems, logical axioms, shape descriptions, and even English sentences.” — Push Singh’s webpage

### D.2 COMPARABLE COGNITIVE ARCHITECTURES

#### D.2.1 *EM-ONE*

#### D.2.2 *Icarus*

#### D.2.3 *ACT-r*

#### D.2.4 *Soar*



## RELATED RESEARCH IN COMPUTER SCIENCE

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### E.1 CLOUD COMPUTING

### E.2 DATABASES AND KNOWLEDGE REPRESENTATION





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- [1] Robert Bringhurst. *The Elements of Typographic Style*. Version 2.5. Hartley & Marks, Publishers, Point Roberts, WA, USA, 2002.
- [2] David Hume. *Enquiries concerning the human understanding: and concerning the principles of morals*, volume 921. Clarendon Press, 1902.
- [3] Marvin Minsky. Logical vs. analogical or symbolic vs. connectionist or neat vs. scruffy. In *Artificial intelligence at MIT expanding frontiers*, pages 218–243. MIT press, 1991.



## COLOPHON

This thesis was typeset with  $\text{\LaTeX}_{2\epsilon}$  using Hermann Zapf's *Palatino* and *Euler* type faces (Type 1 PostScript fonts *URW Palatino L* and *FPL* were used). The listings are typeset in *Bera Mono*, originally developed by Bitstream, Inc. as "Bitstream Vera". (Type 1 PostScript fonts were made available by Malte Rosenau and Ulrich Dirr.)

The typographic style was inspired by [Bringhurst's](#) genius as presented in *The Elements of Typographic Style* [1]. It is available for  $\text{\LaTeX}$  via CTAN as "[classicthesis](#)".

NOTE: The custom size of the textblock was calculated using the directions given by Mr. Bringhurst (pages 26–29 and 175/176). 10 pt Palatino needs 133.21 pt for the string "abcdefghijklmnopqrstuvwxyz". This yields a good line length between 24–26 pc (288–312 pt). Using a "double square textblock" with a 1:2 ratio this results in a textblock of 312:624 pt (which includes the headline in this design). A good alternative would be the "golden section textblock" with a ratio of 1:1.62, here 312:505.44 pt. For comparison, DIV9 of the `typearea` package results in a line length of 389 pt (32.4 pc), which is by far too long. However, this information will only be of interest for hardcore pseudo-typographers like me.

To make your own calculations, use the following commands and look up the corresponding lengths in the book:

```
\settowidth{\abcd}{abcdefghijklmnopqrstuvwxyz}
\the\abcd\ % prints the value of the length
```

Please see the file `classicthesis.sty` for some precalculated values for Palatino and Minion.

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## DECLARATION

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Put your declaration here.

*Cambridge, August 2011*

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Bo Morgan