NOVAMENTE

A Practical Architecture for Artificial General Intelligence

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The Novamente Project

• Long-term goal:

- creating "artificial general intelligence" approaching and then exceeding the human level
- to be approached via a series of incremental phases
 - Learning programme inspired by human developmental psychology
 - The system is taught via its embodiment in a 3D simulation world

• **Novamente Al Engine:** an integrative Al architecture

- Overall architecture inspired by cognitive science
- a "weighted labeled hypergraph" knowledge representation
 - smoothly spans perception, cognition and action
 - Aspects in common with semantic nets and attractor neural nets
- Learning via computer science algorithms:
 - evolutionary programming (a special kind of EDA)
 - probabilistic inference (Probabilistic Logic Networks)
- efficient, scalable C++/Linux implementation
- Currently parts of the Novamente codebase are being used for commercial projects
 - natural language processing
 - biological data analysis



Overview Papers

• The Novamente AI Engine

 – IJCAI Workshop on Intelligent Control of Agents, Acapulco, August 2003

• Novamente: An Integrative Architecture for Artificial General Intelligence

AAAI Symposium on Achieving Human-Level Intelligence
 Through Integrated Systems and Research, Washington
 DC, October 2004

- Patterns, Hypergraphs and General Intelligence

 World Congress on Computational Intelligence, Vancover CA, July 2006
- Chapter on Novamente in

Artificial General Intelligence volume, Springer Verlag,
2006

Novamente-Related Books-in-Progress

• The Hidden Pattern

- Related philosophy of mind
- In press; to appear 2006
- Probabilistic Term Logic
 - -In final editing stage; to be submitted 2006
- Engineering General Intelligence
 - -In final editing stage
 - -Reviews the overall NM design
 - -May or may not be submitted (AI Safety concerns)
- <u>Artificial Cognitive Development</u>
 - -Developmental psychology for Novamente and other AGIs
 - -In preparation



The Grand Vision

- Conceptual Background
- Teaching Approach
- Knowledge Representation
- Software Architecture
- Learning Dynamics

The Current Reality

- Implemented Components
- AGISim Experiments
- NLP Experiments

The Path Ahead



Novamente: The Grand Vision



Conceptual Background: Probabilistic Patternism

- Founded on a "patternist philosophy of mind"
- An intelligent system is conceived as a system for recognizing patterns in the world and in itself
- Probability theory is used as a language for quantifying and relating patterns
- Logic (term, predicate, combinatory) is used as a base-level language for expressing patterns
- Self-analysis allows the system to recognize and utilize patterns existing emergently among numerous logical expressions



Conceptual Background: Novamente Learning Dynamics

- <u>Evolutionary learning</u> is used to generate speculative new patterns
- Logical inference is used to systematically extrapolate known patterns
 - Accounting appropriately for <u>uncertainty in</u> <u>inference</u> is critical
- Simpler, <u>statistical pattern mining</u> algorithms are also incorporated



Conceptual Background: Definition of Intelligence

- Intelligence is considered as the ability to achieve complex goals in a complex environment
- Goals are achieved via recognizing probabilistic patterns of the form "Carrying out procedure P in context C will achieve goal G."



The Structure of Intelligence, Springer-Verlag, 1993

The Evolving Mind, Gordon and Breach, 2003

Chaotic Logic, Plenum Press, 1994

From Complexity to Creativity, Plenum Press, 1997

Creating Internet Intelligence, Kluwer Academic, 2001

The Hidden Pattern, Brown Walker Press, 2006

Page Count = 472; Spine = 0.951 "

THE

HIDDEN

GOERTZEL

A Patternist Philosophy of Mind

The Hidden Pattern presents a novel philosophy of mind, intended to form a coherent conceptual framework within which it is possible to understand the diverse aspects of mind and intelligence in a unified way. The central concept of the philosophy presented is the concept of "pattern": minds and the world they live in and co-create are viewed as patterned systems of patterns, evolving over time, and various aspects of subjective experience and individual and social intelligence are analyzed in detail in this light.

Many of the ideas presented are motivated by recent research in artificial intelligence and cognitive science, and the author's own AI research is discussed in moderate detail in one chapter. However, the scope of the book is broader than this, incorporating insights from sources as diverse as Vedantic philosophy, psychedelic psychotherapy, Nietzschean and Peircean metaphysics and quantum theory. One of the unique aspects of the patternist approach is the way it seamlessly fuses the mechanistic, engineering-oriented approach to intelligence and the introspective, experiential approach to intelligence.



THE HIDDEN PATTERN A Patternist Philosophy of Mind



The Hidden Pattern:

Contents

- 1. Meta-Philosophy
- 2. Kinds of Minds
- 3. Universal Mind
- 4. <u>Intelligence</u>
- 5. Experience
- 6. Four Levels of Mind
- 7. Complexity
- 8. Quantum Reality and Mind
- 9. <u>Free Will</u>
- 10. Emotion
- 11. Autopoiesis
- 12. Evolution
- 13. Science
- 14. Language
- 15. Toward Artificial Minds
- 16. Post-Embodied AI
- 17. Causation
- 18. Belief and Self Systems
- 19. Creative Intuition
- 20. Mindfulness and Evil
- 21. Immortality
- 22. Compassion and Ethics

Appendices

- A1. Toward a Mathematical Theory of Pattern
- A2. Toward a Mathematical Theory of Mind
- A3. Notes on the Formalization of Causal Inference



AI Teaching Methodology

- Embodiment
- Post-embodiment
- Developmental Stages



The Power of Embodiment

Embodiment (real or virtual) provides a would-be AGI with

- Symbol grounding
 - Most crucially: grounding of subtle words like prepositions
- An effective medium for learning complex cognitive skills
 - attention allocation
 - procedure-learning
 - inference control
- A sense of self
 - Critical for cognition as well as mental health
- Empathy with humans



AGISim:

An Open-Source Simulation Environment for AGI

- AI systems can sense and act in real-time via embodiment in a 3D virtual world
- Uses CrystalSpace (open-source game engine) for visualization
- Provides AI systems with multisensory inputs
 - visual inputs at varying levels of granularity: pixels, polygons or objects
 - hearing, touch, proprioception, ...
- Integration with natural language interface for fluid, situated communication
- Suitable for teaching/learning based on a developmentalpsychology-based methodology
- Compatible with Novamente but usable by any AI system via a simple sockets-based protocol





Post-Embodied Al

Al systems may viably synthesize knowledge gained via various means

- virtually embodied experience
 AGISim
- physically embodied experience
 Robotics
- explicit encoding of knowledge in natural language
- ingestion of databases
 - WordNet, FrameNet, Cyc, etc.
 - quantitative scientific data







Artificial Cognitive Development :

Contents

(with Stephan Vladimir Bugaj, Ari Heljakka. ??)

- 1. Cognitive Development from a Systems Theory Perspective
- 2. Human versus Artificial Developmental Psychology
- 3. Object Recognition and Object Permanence
- 4. Grounding Semantic Primitives
- 5. Building the Phenomenal Self
- 6. Experiential Language Learning
- 7. Learning "Theory of Mind"
- 8. Learning Conservation Laws
- 9. Learning Ethical Behavior



Knowledge Representation



Novamente's "Atom Space"

- Atoms = Nodes or Links
- Atoms have
 - Truth values (probability + weight of evidence)
 - Attention values (short and long term importance)
- The Atomspace is a weighted, labeled hypergraph



Novamente's "Atom Space"

- Not a neural net
 - No activation values, no attempt at low-level brain modeling
- Not a semantic net
 - Atoms may represent percepts, procedures, or parts of concepts
 - Most Nodes do not correspond to any simple English label





Node Variety	Description
Perceptual Nodes	These correspond to perceived items, like WordInstanceNode, CharacterInstanceNode, NumberInstanceNode, PixelInstanceNode
Procedure Nodes	These contain small programs called "schema," and are called SchemaNodes. Action Nodes that carry out logical evaluations are called PredicateNodes.
ConceptNodes	This is a "generic Node" used for two purposes. An individual ConceptNode may represent a category of Nodes. Or, a Map of ConceptNodes may represent a concept.
Psyche Nodes	These are GoalNodes and FeelingNodes, which are special PredicateNodes that play a special role in overall system control, in terms of monitoring system health, and orienting overall system behavior.

Link Variety	Description
Logical links	These represent symmetric or asymmetric logical relationships , either among Nodes (InheritanceLink, SimilarityLink), or among links and PredicateNodes (e.g. ImplicationLink, EquivalenceLink).
MemberLink	These denote fuzzy set membership .
Associative links	These denote generic relatedness, including HebbianLink learned via Hebbian learning, and a simple AssociativeLink representing relationships derived from natural language or from databases.
ExecutionOutput Link	These indicate input-output relationships among SchemaNodes and PredicateNodes and their arguments.
Action-Concept links	Called ExecutionLinks and EvaluationLinks, these form a conceptual record of the actions taken by SchemaNodes or PredicateNodes .
ListLink and concatListLink	These represent internally -created or externally - observed lists, respectively .

Links may denote generic association ...



... or precisely specified relationships





Attention Values

Low Long-term Importance Hig

High Long-term Importance

Low Short-term Importance	Useless	Remembered but not currently used (e.g. mother's phone #)
High Short-term Importance	Used then forgotten (e.g. most precepts)	Used and remembered

Truth Values

	Strength low	Strength high
Weight of evidence low	Weakly suspected to be false	Weakly suspected to be true
Weight of evidence high	Firmly known to be false	Firmly known to be true

Software Architecture





MindAgent	Function
Spontaneous Inference	Uses PLN inference to infer new links from existing ones, driven by a general "fitness function" that aims to create surprising or useful information
Goal-Directed Inference	Uses PLN inference to figure out ho w to achieve current goals
Goal Refinement	Uses PLN inference and heuristics to create new goals refining existing ones
Predicate Schematization	Transforms logical knowledge regarding goal achievement into schemata that can be executed to achieve goals
LogicalLinkMining	Creates logical links out of nonlogical links (a form of pattern recognition)
Evolutionary Predicate Learning	Creates PredicateNodes containing predicates that predict membership in ConceptNodes
Clustering	Creates ConceptNodes represent ing clusters of existing ConceptNodes
Importance Updating	Updates Atom "importance" variables and other related quantities
Hebbian Association Formation	Builds and modifies HebbianLinks between Atoms, based on a PLN-derived Hebbian reinforcement learning rule
Evolutionary Schema Learning	Creates SchemaNodes that fulfill criteria, e.g. that are expected to satisfy given GoalNodes
Concept Formation	Creates speculative, potentially interesting new ConceptNodes via blending existing ones

MindAgent	Function (Table Continued)
Predicate/Schema Formation	Creates speculative, potentially interesting new SchemaNodes and PredicateNodes by blending existing ones
Schema Execution	Enacts active SchemaNodes, allowing the system to carry out coordinated trains of action
Map Encapsulation	Scans the AtomTable for patterns and creates new Atoms embodying these patterns
Map Expansion	Takes schemata and predicates embodied in nodes, and expands them into multiple Nodes and links in the AtomTable (thus transforming complex Atoms into Maps of simple Atoms)
Homeostatic Parameter Adaptation	Applies evolutionary programming to adaptively tune the parameters of the system







Learning Dynamics



Engineering General Intelligence:

Contents

- 1. Patterns, Hypergraphs and General Intelligence
- 2. Atoms and Atomspaces
- 3. Denoting Atoms
- 4. Combo Trees and the Combo Language
- 5. The Mind OS
- 6. <u>Embodied Goal-Oriented Cognition</u>
- 7. Procedure Execution
- 8. Dimensional Embedding
- 9. <u>Evolutionary Procedure Learning</u>
- 10. <u>Speculative Concept Formation</u>
- 11. Integrative Procedure and Predicate Learning
- 12. <u>Attention Allocation</u>
- 13. <u>Map Encapsulation and Expansion</u>



Probabilistic Logic Networks:

Contents

(with Matt Ikle', Izabela Freire Goertzel, Ari Heljakka)

- 1. Introduction
- 2. Knowledge Representation
- 3. Experiential Semantics
- 4. <u>First-Order Extensional Inference</u>: Rules and Strength Formulas
- 5. Specialized Approaches for Large-Scale Inference
- 6. The Inference Metric
- 7. Error Magnification in Inference Formulas
- 8. Inference with Distributional Truth Values
- 9. <u>Higher-Order Extensional Inference</u>: Rules and Strength Formulas
- 10. <u>Intensional Inference</u>
- 11. Weight of Evidence
- 12. Temporal and Causal Inference
- 13. Applying Probabilistic Logic Networks



Novamente contains multiple heuristics for Atom creation, including "blending" of existing Atoms



Example PLN Rules Acting on ExtensionalInheritanceLinks



Unification:

Imp <1.00, 0.95>
AND
Inh(\$t,toy)
Inh(\$b,bucket)
Eval placed_under(\$t,\$b)
Eval found_under(\$t,\$b)
Inh (toy_6,toy)
Inh (red_bucket_6,bucket)
Eval placed_under(toy_6,red_bucket_6)
AND <1.00, 0.98>
Inh (toy_6,toy)
Inh (red_bucket_6,bucket)
Eval placed_under(toy_6,red_bucket_6)

|-

Imp <1.00, 0.95>
AND <1.00, 0.98>
Inh (toy_6,toy)
Inh (red_bucket_6,bucket)
Eval placed_under(toy_6,red_bucket_6)
Eval found_under(toy_6,red_bucket_6)

Higher-order PLN inference handles complex inferences with variables, quantifiers, etc.



Atoms associated in a dynamic "map" may be grouped to form new Atoms: the Atomspace hence *explicitly representing patterns in itself*



Grounding of natural language constructs is provided via inferential integration of data gathered from linguistic and perceptual inputs



Attention Allocation



Novamente: The Current Reality



Implemented Components

Novamente core system

- AtomTable, MindAgents, Scheduler, etc.
- Now runs on one machine; designed for distributed processing
- PLN
 - Relatively crude inference control heuristics
 - Simplistic predicate schematization

• MOSES

 Little experimentation has been done evolving procedures with complex control structures

• Schema execution framework

- Enacts learned procedures
- AGISim
 - And proxy for communication with NM core
- NLP front end
 - External NLP system for "cheating" style knowledge ingestion



Simple, Initial AGISim Experiments

- Fetch
- Tag
- Piagetan A-not-B experiment
- Word-object association





Inference Trajectory for A-not-B

Target: Eval found_under(toy_6,\$1)

Step 1

|-

ANDRule:

Inh (toy_6,toy) Inh (red_bucket_6,bucket) Eval placed_under(toy_6,red_bucket_6)

AND <1.00, 0.98> Inh (toy_6,toy) Inh (red_bucket_6,bucket) Eval placed_under(toy_6,red_bucket_6) Step 2 Unification:

 Imp <1.00, 0.95>
 Eva

 AND
 AND

 Inh(\$t,toy)
 In

 Inh(\$b,bucket)
 In

 Eval placed_under(\$t,\$b)
 In

 Eval found_under(\$t,\$b)
 E

 AND
 |

 Inh (toy_6,toy)
 Eval

 Inh (red_bucket_6,bucket)
 Eval

|-

Imp <1.00, 0.94> AND Inh (toy_6,toy) Inh (red_bucket_6,bucket) Eval placed_under(toy_6,red_bucket_6) Eval found_under(toy_6,red_bucket_6)

Step 3 Modus Ponens

Imp <1.00, 0.94> AND Inh (toy_6,toy) Inh (red_bucket_6,bucket) Eval placed_under(toy_6,red_bucket_6) Eval found_under(toy_6, red_bucket_6) AND <1.00, 0.98> Inh (toy_6,toy) Inh (red_bucket_6,bucket) Eval placed_under(toy_6,red_bucket_6)

Eval found_under(toy_6, red_bucket_6) <1.00, 0.93>

Predicate Schematization

Logical knowledge

EvPredImp <0.95, 0.3> Execution try(goto box) Eval near box

SimultaneousImplication Eval near box Eval can_do(push box)

EvPredImp <0.6,0.4> And Eval can_do(push box) Execution try(push box) Evaluation Reward



Predicate schematization

Executable procedure

repeat goto box near box repeat push box Reward

NLP Subsystem

- RelEx (Relationship Extractor)
 - Developed under subcontract to INSCOM
 - Based on Carnegie-Mellon link parser
 - Add hand-crafted semantic mapping rules
 - Add statistical methods for disambiguation and reference resolution
 - Designed to allow easy feeding of NL knowledge into Novamente
 - Can be modified to enable simple language generation

• INLINK

- Interactive system for NL knowledge entry
- Allows user to correct RelEx's mistakes prior to submission of knowledge into Novamente

NLP Subsystem

Viewed as "scaffolding" from an AGI perspective

Using it, we may feed Novamente semantic information that will help guide its experiential, embodied language learning process



Logon	Logout	Change password	User administration	Exit

Knowledge Entry Queries

Mugniyarris a senior member or hizbulian.

He is one of the founders of Hizbullah.

He is the head of security for Hizbullah.

The members of Hizbullah are Shi'ite Muslims.

He was responsible for the bombing of the U.S. embassy in Beirut in 1983.

63 people died in the bombing of the U.S. embassy in Beirut in 1983.

He was also responsible for the truck bombing of the U.S. Marine barracks in Beirut in 1983.

Sentence		Context
he was also responsible for the truck bombing of the U.S. Marine barracks in Beir	ut in 1983 .	dave[Imad_Mugniyah]
Process Submit New Next imported	Selected parse: parse1	New Rename Load Import

~

×

SubCategorization Frames All Relations Sense Disambiguation Reference Resolution Entity Categorization Sentence Generation

	~
also = [responsible also] %past	
subjAGENT for	
responsible = [he responsible bombing] singular %past uncountable	
subj-nFOCUS truck = [bombing truck] uncountable	
in[2] of bombing = [bombing 1983 barrack] uncountable plural	
subj-nFOCUS U.SMarine = [barrack U.SMarine] plural singular	
in[1] barrack = { barrack Beirut }	~

Logon Logout Change password User administration Exit

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Process Submit New Next imported

Selected parse: parse1

^

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New Rename Load Import

-

SubCategorization Frames | All Relations | Sense Disambiguation | Reference Resolution | Entity Categorization | Sentence Generation |

Disambiguated words:	
he was also respo	onsible for the truck bombing of the U.S. Marine barracks in Beirut in 1983.
l Disambiguated SARs (:	Syntatic Argument Relations):
subj-n(truck,b subj-r(also,re	ombing) sponsible)
Below, you can select	the correct sense for each word or SAR:
he	N*Male_pronoun [he] : Refers to a male.
also	R*00048649 [as_well, besides, too, also, likewise] : in addition; "he has a Mercedes, too"
responsible	A*00321319 [responsible, responsible_for(p)] : being the agent or cause; "determined who was the responsible party"; "termites were responsible for the dam
for	forFOCUS [for] : For all his large size, he moves gracefully. (in spite of)
truck	forFOCUS [for] : For all his large size, he moves gracefully. (in spite of) forSUITABILITY [for] : Our men are ready for action. It is not for you. (suitability) forEXCHANGE [for] : He paid ten for a hat. He received a ball for a table. (Used to express equality or equivalence in exchange, number or quantity.) forFOCUS2 [for] : For one thing, the price is too high. For example, this sentence is fairly boring and slightly annoying. (implied selection) forEXCHANGE2 [for] : Go to the store for me. (in place of)
Create/modify s	enses

gon Logout Change password User administration Exit		
nowledge Entry Oueries		
Mugniyan is a senior member of Hizbulian.		
He is one of the founders of Hizbullah.		
He is the head of security for Hizbullah.		
The members of Hizbullah are Shi'ite Muslims.		
e was responsible for the bombing of the U.S. embassy in Beirut	in 1983.	
53 people died in the bombing of the U.S. embassy in Beirut in 198	13.	
e was also responsible for the truck bombing of the U.S. Marine l	parracks in Beirut in 1983.	
Contract of the second s		C
Sentence		Context
he was also responsible for the truck bombing of the U.S. Marin	e barracks in Beirut in 1983 .	uave[imau_mugniyan]
Process Submit New Next imported	Selected parse: parse1	New Pename Load Import
		Mew Kenane Load Import
of(B,B1) inheritance(B1,barrack) VounNumber(B1,plural) n[1](B1,B2) inheritance(B2,Beirut) VounNumber(B2,singular) inheritance(H,he) VounNumber(H,singular) inheritance(R,responsible) Tense(R, %poast)		
for(R,B) subjAGENT(R,H) Inheritance(T,truck) subj-nFOCUS(T,B) Inheritance(U,U.SMarine) VounNumber(U,singular)		

Logon Logout Change password User administration Exit

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Process Submit New Next imported

Selected parse: parse1

^

Y

New Rename Load Import

-

SubCategorization Frames | All Relations | Sense Disambiguation | Reference Resolution | Entity Categorization | Sentence Generation |

Disambiguated words:	
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Create/modify s	enses

Novamente: The Path Ahead



Hypothetical Timeline

<u>2006-2007</u>:

-Complete "infantile" stage behaviors in AGISim

-Initial integration of existing NLP system

<u>2007-2019</u>:

-Enter concrete-operational stage

-Integration of NLP code with learning mechanisms

-Implement distributed processing infrastructure

2008-2012:

-Powerful natural-language question-answering

-Focus on embodied language learning

<u>2009-2014</u>:

-Formal stage?

-Integration of Mizar DB?



Credits

Novamente:

- Cassio Pennachin
- Moshe Looks
- Ari Heljakka
- Andre Senna
- Izabela Freire Goertzel

AGIRI.org

Artificial General Intelligence

Research Institute

- Welter Silva
- Michael Ross
- Hugo Pinto

AGISim:

- Ari Heljakka
- Welter Silva

