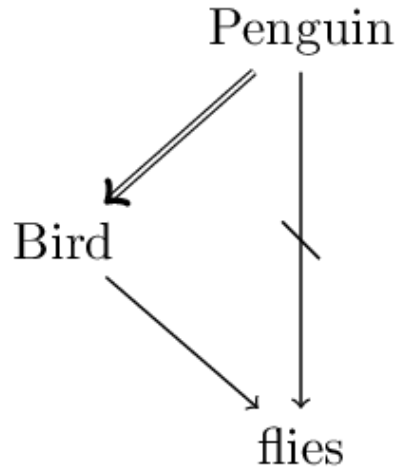


An Introduction to Non-Axiomatic Logic

James Oswald

$$\begin{array}{c}
 \frac{C(t, P(a, t, \phi) \rightarrow K(a, t, \phi))}{C(t, \phi) \ t \leq t} \quad [R_1] \quad \frac{C(t, K(a, t, \phi) \rightarrow B(a, t, \phi))}{K(a, t, \phi)} \quad [R_2] \\
 \frac{C(t, \phi) \ t \leq t}{K(a_1, t_1, \dots, K(a_n, t_n, \phi) \dots)} \quad [R_4] \quad \frac{K(a, t, \phi)}{\phi} \quad [R_3] \\
 \text{R} \quad \text{A} \quad \text{I} \quad \text{R} \\
 \text{Rensselaer AI and Reasoning Lab}
 \end{array}$$

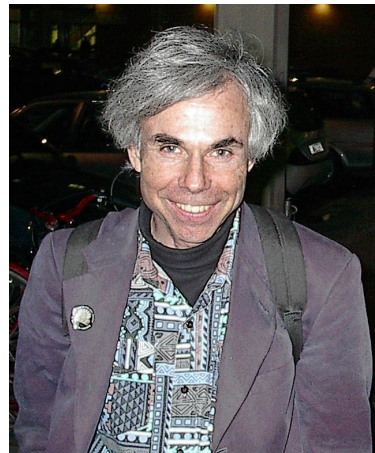
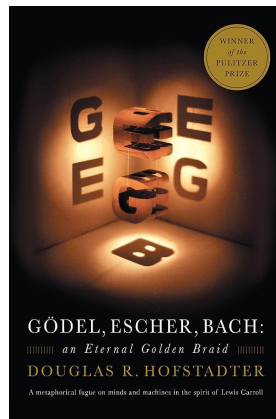


Part 1: Background

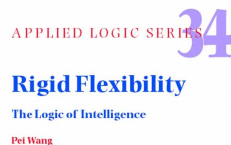


Pei Wang

- Contributor for the official Chinese translation of Godel-Escher-Bach as an undergraduate at Peking University while researching AI (1980s)
- Finished his PhD under Douglas Hofstadter at Indiana University (1995)
- Founded the AGI Conference Series with Ben Goertzel (2008)
- Founding Editor of the Journal of AGI (2011)



Timeline



Wang's Dissertation

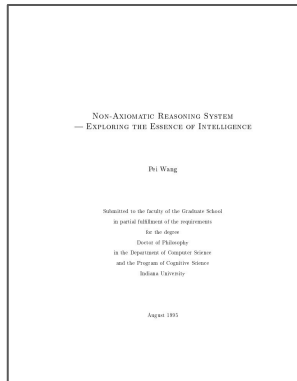
Wang publishes his dissertation, "Non-Axiomatic Reasoning System", Providing the first complete account of basic NAL built up over the early 1990s. Builds up to NAL Level 3.



"Non Axiomatic Logic"

Builds up to NAL Level 9, adding support in NAL for Events, Goals, Tasks, Operations.

1995

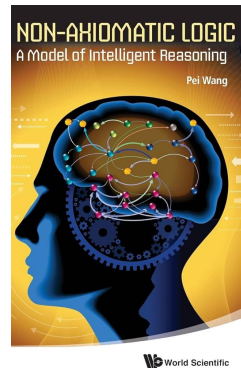


2006

"Rigid Flexibility, The Logic Of Intelligence"

Formalizes NAL, provides better comparisons with other systems.

2012



2023

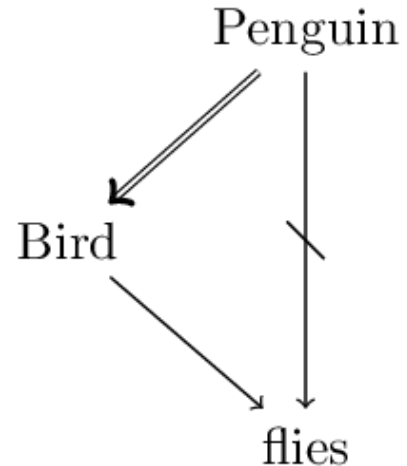
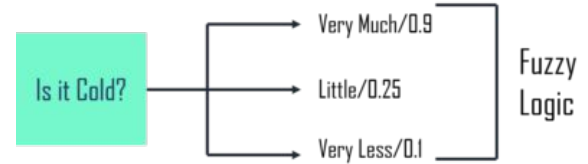
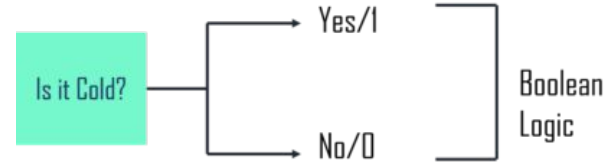
Still in Active Research and Development

~300 items on GS with NAL as title or topic
~400 items on GS with NARS as title or topic

2nd only paradigm to Hutter's AIxI in AGI circles.
Far more pragmatic than AIxI.

Features of Non-Axiomatic Logic

- Term Based (Syllogistic/Aristotelian)
 - Propositions take the form of relations between two objects, a subject and object (terms)
- Fuzzy
 - Statements are not just true or false but can take real numbered truth values between zero and one.
 - In NAL truth value corresponds to an agents belief in the truth of the statement.
- Non-monotonic (Defeasible)
 - Allows retraction of past inferences.
 - Can handle inconsistent information and perform belief revision over time as knowledge improves.



Levels of Non-Axiomatic Logic

- NAL 1: Fuzzy non-monotonic inheritance logic on atoms
- NAL 2: More expressive term relations (similarity, properties)
- NAL 3: Composite Terms
- NAL 4: Arbitrary relations
- NAL 5: Higher order reasoning on terms with predicates as terms.
- NAL 6: Quantification
- NAL 7: ...

Each Level has a corresponding “Idealized Logic” removing non-monotonicity and fuzziness.

Part 2: Wang's Inheritance Logic (IL-1)

Basic Aristotelian Term Logic

An assertion is a statement that is true or false (affirmed or denied).

James is Fat, Cats are green, Selmer is not an Elephant

Each assertion contains a subject and a predicate

A term is either a subject or predicate of an assertion:

Terms from the assertions: {James, Fat, Cats, Green, Selmer, Elephant}

Basic Aristotelian Term Logic (Cont.)

A term is either universal or individual

Individuals are objects, universals are categories or sets of individuals.

The subject of an assertion of an can either be individual or universal, while the predicate must be a universal.

James is Fat, Cats are green, Selmer is not an Elephant

Individuals: {James, Selmer}

Universals: {Cat, Fat, Green, not Elephant}

Inheritance Logic (IL-1)

IL-1 is a term logic, who's only assertions are inheritance relation (\rightarrow).

Assertions in IL-1 are called statements and take the form:

Subject \rightarrow Predicate

This is read as

- (1) "Subject is a special type of Predicate"
- (2) "Predicate is a generalization of Subject"

Table 2.1. The grammar rules of IL-1.

$\langle statement \rangle ::= \langle term \rangle \langle copula \rangle \langle term \rangle$
$\langle copula \rangle ::= \rightarrow$
$\langle term \rangle ::= \langle word \rangle$

Examples of IL-1 statements

Robin \rightarrow Bird (Robins are a special case of birds)

Water \rightarrow Liquid (Water is a type of liquid)

Bird \rightarrow Animal (Bird is a special case of animal)

Semantic Properties of \rightarrow

Wang defines the inheritance relation to be reflexive and transitive. From this we can derive two theorems concerning truth in the meta-logic of IL-1.

(Reflexivity of \rightarrow)

For any term T : $T \rightarrow T$ is true

(Transitivity of \rightarrow)

For any terms T_1, T_2, T_3 , if $T_1 \rightarrow T_2$ and $T_2 \rightarrow T_3$ are true then $T_1 \rightarrow T_3$ is true

A tautology in IL-1 is any statement in the form $T \rightarrow T$

Defines a weak semantics, but so far the class of true statements is quite boring and we don't have anything we can use our transitivity theorem with.

Semantics of IL-1

Wang's Experience Grounded Semantics

Semantics of classical logic typically is only concerned with discovering the truth value of statements.

Experience Grounded Semantics of IL-1 care **BOTH** about defining truth of statements **AND** the meanings of terms within those statements.

Example: given the statement $\text{Bird} \rightarrow \text{Animal}$ we would like to know not only if this statement is true, but would also like to know what a bird and what an animal is.

*This only makes sense in the context of knowledge we ground semantics in this prior knowledge.

Semantics of IL-1: Experience and Knowledge

An experience is a finite non-empty set of statements in IL-1 that does not include any tautologies. We will refer to this experience as K. For example:

$$K = \{\text{robin} \rightarrow \text{bird}, \text{bird} \rightarrow \text{animal}, \text{water} \rightarrow \text{liquid}\}$$

knowledge is defined as the transitive closure (with respect to \rightarrow) of an experience not containing any tautologies, we use $*$ to denote this transformation.

$$K^* = \{\text{robin} \rightarrow \text{bird}, \text{bird} \rightarrow \text{animal}, \text{water} \rightarrow \text{liquid}, \text{robin} \rightarrow \text{animal}\}$$

Note that if we have $K2 = \{T1 \rightarrow T2, T2 \rightarrow T1\}$ then $K2 = K2^*$

Semantics of IL-1: Truth of Statements

Truth is then defined with respect to the knowledge derived from an experience.

A statement φ in IL-1 is said to be true given an experience K iff φ is in K^* or it is a tautology, otherwise it is false.

In metalogic we can express this semantic definition of truth as:

$$K \models_{IL} \varphi \stackrel{\text{def}}{=} (\varphi \in K^*) \vee (\exists T: \varphi = (T \rightarrow T))$$

This dichotomy in the definition of truth leads to two types of truth

- **synthetically true** statements derived from experience ($\varphi \in K^*$)
- **analytically true** statements considered to be “True by definition” ($\exists T: \varphi = (T \rightarrow T)$).

Semantics of IL-1: Meaning of Terms

The meaning of a term is defined as its relation with other terms according to experience.

Let $V(K)$ be the set of terms in an experience K .

Ex. $V(\{T1 \rightarrow T2, T2 \rightarrow T3\}) = \{T1, T2, T3\}$

The **extension** of a term T with respect to K is $\{x \in V(K) \mid x \rightarrow T \in K\} \cup \{T\}$.

The **intention** of a term T with respect to K is $\{x \in V(K) \mid T \rightarrow x \in K\} \cup \{T\}$.

“Known specializations of T in K ” vs “Known generalizations of T in K ”

Wang asserts that the meaning of a term **IS** its intension and extension. In NAL-1, meaning of terms is used to help derive fuzzy truth values.

Inference Rule of IL-1

The single inference rule of IL-1 is “inheritance deduction”. (Transitivity of \rightarrow)

<i>premise₁</i>	<i>premise₂</i>	<i>conclusion</i>
$M \rightarrow P$	$S \rightarrow M$	$S \rightarrow P$

It should be clear that we have a metalogical completeness result for semantic and syntactic truth in IL-1. (Note that we assume $T \rightarrow T$ is true for all T for \vdash_{IL})

$$K \models_{\text{IL}} \varphi \Leftrightarrow K \vdash_{\text{IL}} \varphi$$

Can also be called a syllogism rather than inference rule, conforms to Aristotle’s definition.

A Brief Stop at IL-5: Statements as Terms

IL-5 Syntax

IL-5 lets us make basic logical statements about IL-1 statements right in the logic, by considering some statements as terms. Adds Copulae for implication (not material implication) and equivalence.

$$\begin{aligned}\langle term \rangle &::= (\langle statement \rangle) \\ \langle statement \rangle &::= \langle term \rangle \\ &\quad | (\neg \langle statement \rangle) \\ &\quad | (\wedge \langle statement \rangle \langle statement \rangle^+) \\ &\quad | (\vee \langle statement \rangle \langle statement \rangle^+) \\ \langle copula \rangle &::= \Rightarrow \mid \Leftrightarrow\end{aligned}$$

IL-5 Semantics: Desires for Implication

Formally we want to define semantics of \Rightarrow to function as it does in natural deduction, such that $(\varphi \Rightarrow \psi)$ is true only if you can derive ψ from φ in a finite number of steps.

$$K \models_{\text{IL}} (\varphi \Rightarrow \psi) \Leftrightarrow K \cup \{\varphi\} \vdash_{\text{IL}} \psi$$

Since IL is a term logic we also want the restriction that it is impossible to derive $\varphi \Rightarrow \psi$ unless they are related in content, this rules out material implication.

IL-5 Semantics:

Solution: Borrow from our definition of inheritance. Define semantics of implication with respect to experience. If the sufficient conditions for φ are a subset of the sufficient conditions for ψ then $\varphi \Rightarrow \psi$. Forces φ, ψ to be derivable and “related”.

The **sufficient conditions** of a term T with respect to K is defined

$$T^S_K = \{x \in V(K) \mid x \Rightarrow T \in K\}$$

The **necessary conditions** of a term T with respect to K is defined

$$T^N_K = \{x \in V(K) \mid T \Rightarrow x \in K\}$$

Then assuming $\varphi, \psi \in K$ we can define implication as

$$K \models_{IL} (\varphi \Rightarrow \psi) \stackrel{\text{def}}{=} \varphi^S_K \subseteq \psi^S_K \text{ or } K \models_{IL} (\varphi \Rightarrow \psi) \stackrel{\text{def}}{=} \psi^N_K \subseteq \varphi^N_K$$

Partial Semantics of IL-5

Function exactly how they do in propositional logic, semantic entailment can be seen as a recursively defined proposition down to terminal cases, Atomic Terms, inheritance, and implication.

$$K \models_{IL} \neg \varphi \stackrel{\text{def}}{=} \neg K \models_{IL} \varphi$$

$$K \models_{IL} (\varphi \wedge \psi) \stackrel{\text{def}}{=} (K \models_{IL} \varphi) \wedge (K \models_{IL} \psi)$$

$$K \models_{IL} (\varphi \vee \psi) \stackrel{\text{def}}{=} (K \models_{IL} \varphi) \vee (K \models_{IL} \psi)$$

$$K \models_{IL} (\varphi \rightarrow \psi) \stackrel{\text{def}}{=} (\varphi \rightarrow \psi) \in K^* \vee \varphi = \psi \text{ (Where } K^* = \text{transitive closure of } K \text{ under } \rightarrow \text{)}$$

$$K \models_{IL} (\varphi \Rightarrow \psi) \stackrel{\text{def}}{=} (\varphi \Rightarrow \psi) \in K^\dagger \vee \varphi = \psi \text{ (Where } K^\dagger = \text{transitive closure of } K \text{ under } \Rightarrow \text{)}$$

Fin