# The OpenNARS implementation of the Non-Axiomatic Reasoning System

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- 0.1 Context
- 0.2 Learned in this study
- 0.3 Things to explore
- 1 Overview

#### 2 1 Introduction

- NARS has a memory, a logic component and a control component
- The logic component consists of inference rules that work on statements, where the statements are goals, questions and beliefs
  - A statement can be eternal (non time-dependent) or events (time-dependent)
  - Beliefs are statements that the system believes to be true to a certain extent
  - An inference task is a statement to be processed, with additional control relevant information
- NAL: Non-Axiomatic Logic
- Narsese: Language for representing statements

## 3 2 Memory

- 3 primary operations:
  - Return the best ranked belief or goal for inference within concepts (local inference)
  - Provide a pair of contextually relevant and semantically related statements for inference between concepts (general inference)
  - Add statements to memory whilst maintaining constraints on the system
- The main loop:
  - Get a concept from memory
  - Get a task and belief related to the selected concept
  - Derive new tasks from the selected task and belief
  - Put the involved items back into the corresponding bags
  - Put the new tasks into the corresponding bags
- System of metadata (budget and stamp)
  - Used to prevent certain forms of invalid inference such as double counting evidence and cyclic reasoning
  - Abstracts temporal requirements away from the Narsese grammar
  - Provides certain implementation efficiencies
- A budget determines the allocation of system resources (time and space) and is defined as  $(p, d, q) \in [0, 1]x(0, 1)x[0, 1]$ 
  - p: priority

- -d: durability
- -q: quality
- A stamp is defined as  $(id, t_{cr}, t_{oc}, C, E) \in \mathbb{N} \times \mathbb{N} \times \mathbb{N} \times \mathcal{P}(\mathbb{N})$ 
  - id: unique id
  - $-t_{cr}$ : creation time
  - $-t_{oc}$ : occurrence time
  - -C: syntactic complexity (the number of subterms in the associated term)
  - E: an evidential set
- Curve bag is a data structure that supports a probabilistic selection according to the item priority distribution
- The priority value p of the items in the bag maps to their access frequency by a predefined monotonically increasing function
- Called a curve bag because it allows the user to define a custom curve which is highly flexbile and allows emotional parameters and introspective operators to have influence on this selection
- The memory consists of a curve bag of concepts, where a concept is a container for: a concept term, tasklink curve bag, term link curve bag, belief tables and goal tables

### 4 Logic Module

- Composed of two components: an inference rule domain specific language (Meta Rule DSL) and an inference rule execution unit
- The Meta Rule DSL != NAL grammar rules
- Meta Rule DSL: provides a flexible methodology to quickly experiment with alternate inference rules, to support the goal of creating a literate program, and to substantially improve the quality of the software implementation
- Meta inference rules take the following form:
  - $T, B, P_1, ..., P_n \vdash (C1, ..., C_n)$ 
    - T: the task to be processed
    - − B: the belief retrieved for the task
    - $P1, ..., P_n$ : logical predicates dependent on  $T, B, C_1, ..., C_n$
    - $-C_1,...,C_n$ : conclusions in the form  $(D_i,M_i)$  where  $D_i$  is the term of the derived task the conclusion  $C_i$  defines, and  $M_i$  provides additional meta-information, such as which truth function will be used to decide the truth or desire of the conclusion, how the temporal information will be processed, or whether backwards inference is allowed
- The inference rule execution unit roles are:
  - Parse the Meta Rule DSL into an efficient and executable representation
  - Select and execute the relevant inference rules

# 5 4 Temporal Inference Control

- In order to support temporal reasoning, the non-temporal NAL inference rules are extended by adding temporal variants:
  - Temporal window: Events occurring within a specified temporal window will be deemed to have occurred at the same time
  - Temporal chaining: Semantically unrelated events are linked together if they are temporally following one another
  - Interval handling: Events patterns which occur at a given interval from one another can be detected/observed
  - Projection
  - Eternalization
  - Anticipation

### 6 5 Projection and Eternalization

- When a truth value for a statement is projected in time, its value decreases according to the following function:
- $c_{new} = (1 k_c) \times c_{old}$ 
  - $-c_{new}$ : new confidence value the belief
  - $-c_{old}$ : old confidence value the belief
  - $-k_c$ : confidence decay
- $\bullet \quad k_c = \frac{|t_B t_T|}{|t_B t_C| + |t_T t_C|}$ 
  - $-k_c$ : confidence decay
  - $-t_B$ : original occurrence time of the belief
  - $-t_T$ : projected occurrence time of the belief
  - $-t_C$ : current time
- In eternalization, the occurrence time is dropped, so the conclusion is about the general situation
- $c_{new} = \frac{1}{k + c_{old}}$ 
  - $-c_{new}$ : new confidence value the belief
  - $-c_{old}$ : old confidence value the belief
  - k: a global evidence horizon personality parameter

## 7 6 Anticipation

- Based on the observation of an antecedent and behavior, a consequent is excepted (anticipated)
- In the event that an antecedent and behavior is observed, and the consequent is also observed, nothing special needs to be done
- In the opposite case, then the system needs to recognize that the prediction may not be 100% appropriate. Such event will have a high budget and will significantly influence the attention of the system (in order to rectify the situation)

## 8 7 Evidence Tracking

- The truth value of a statement is a  $(w_+, w_-)$  pair, where  $w_+$  represents positive evidence and  $w_-$  represents negative evidence
- Can alternatively be represented as a confidence and frequency tuple, where
  - $-c = \frac{w_{+} + w_{-}}{k + w_{+} + w_{-}}$   $-f = \frac{w_{+}}{w_{+} + w_{-}}$
  - -k: global personality parameter that indicates a global evidential horizon
- Evidence follows the following principles:
  - Evidence can only be used once for each statement
  - A record of evidence used in each derivation must be maintained, although given AIKR (assumption
    of insufficient knowledge and resources), this is only a partial record, which is not an issue in
    practice
  - There can be positive and negative evidence for the same statement
  - Evidence is not only the key factor to determine truth, but also the key to judge the independence of the premises in a step of inference

# 9 8 Processing of New and Derived Tasks

- Temporal chaining
- Ranking
- Adding to belief/desire table
- Selecting belief for inference
- Revision

• Decision

#### 10 9 Attentional Control

- 3 phases process:
  - Select contextually relevant and semantically related tasks for inference
  - Create or update budget values based on user requirements and/or inference results
  - Update memory with results of the updated task and concepts
- Phase 1: Premises for inference are selected according to the following scheme
  - Select a concept from memory
  - Select a tasklink from this concept
  - Select a termlink from this concept
  - Select a belief from the concept the termlink points to ranked by the task
- Phase 2: Formation of new statements (tasks), with new metadata, from the derivations.
- Phase 3: Process the new tasks and insert them into memory.

#### 11 See also

#### 12 References

• Paper: The OpenNARS implementation of the Non-Axiomatic Reasoning System (4th Draft for Comment)