

# Thinking takes time: A modal active-logic for reasoning in time\*

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## Abstract

Most commonsense reasoning formalisms do not account for the passage of time as the reasoning occurs, and hence are inadequate from the point of view of modeling an agent's *ongoing* process of reasoning. We present a modal active-logic that treats time as a valuable resource that is consumed in each step of the agent's reasoning. We provide a sound and complete characterization for this logic and examine how it addresses the problem of logical omniscience.

## 1 Introduction

All agents, whether human or automated, that function in the real-world are subject to the fact that time is spent as their reasoning progresses. Most commonsense reasoning formalisms do not account for the passage of time as the reasoning occurs, and hence are inadequate from the point of view of modeling an agent's *ongoing* process of reasoning. There are numerous problems in AI-planning and commonsense reasoning where the capacity to reason and act *in* time is of paramount importance. Below is a list of few sample problems in which the passage of time (as the agent reasons) is crucial:

1. *Nell & Dudley and the railroad tracks* : Nell is tied to the railroad tracks and the agent Dudley must figure out and enact a plan to save her in time before an oncoming train approaches.
2. *Examination problem* : A student who is taking an examination must figure out a strategy to decide which problems to work on, how much time to allocate to each, etc. And yet, every second spent in such decision making is a second less to actually solve the problems. Deliberation time is a significant chunk of the total time available which the agent must factor in the reasoning.
3. *The three wise men problem* : The well known puzzle [19, 6, 13] where three wise men, each wearing a cap from a pool of one white and two black caps, are lined up and each is asked to announce the color of the cap on his own head as soon as he knows what it is. The agents must be able to keep track of the time spent in reasoning to solve this problem realistically.

Most formal approaches do not have an appropriate representational framework to tackle time-situated reasoning problems such as the above. They assume that an agent is able to reason forever in a timeless present as if the world had stopped for the agent's benefit. Resource limitations have

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been of some concern in formal work. In particular, the problem of *logical omniscience* has received attention in the epistemic logic literature. It concerns the difficulty with the classical Hintikka possible world semantics [10] that the agent always knows the logical consequences of her beliefs. Work in temporal logic involves reasoning *about* time (e.g., [1, 20, 4]), time is not treated as a crucial resource that must be carefully rationed by the agent, as it is spent in every step of reasoning.

*Step-logics* [7, 27] were introduced as a formal apparatus to model an agent's ongoing process of reasoning. They have since been extended and renamed as *active logics*. In [14, 24, 25] the step-logic framework is used to create an active logic based *fully* deadline-coupled planning and reasoning mechanism which is a combination of declarative and procedural approaches that is capable of solving the above mentioned problems<sup>1</sup>. Although active logics have been characterized and implemented, only limited attempts have been made to give a formal semantics for the step-like reasoning process.

This paper is intended to narrow the gap between previous modal approaches to knowledge and belief and time-situated frameworks such as step-logics which have a means for attributing time to the reasoning process. We discuss the various aspects of logical omniscience and their treatment in section 2. We briefly describe the step-logic approach to reasoning in section 3. In section 4 we present a modal active-logic that is motivated by the work on step-logics, but for which, unlike the former, we can provide a sound and complete modal semantics in section 5. In section 5.1 we examine how our approach addresses the logical omniscience problem. In section 6 we extend the modal active-logic by introducing the notion of focus of attention in order to avoid unrealistic parallelism. We conclude in section 7.

## 2 The various aspects of omniscience and its treatment

Fagin and Halpern [8] have analyzed what is meant by the notion of *logical omniscience*. They define an agent to be logically omniscient if whenever he believes formulas in a set  $\Sigma$ , and  $\Sigma$  logically implies the formula  $\phi$ , then the agent also believes  $\phi$ . They further identify three cases of special interest: (a) *closure under implication*, namely, whenever both  $\phi$  and  $\phi \rightarrow \psi$  are believed then  $\psi$  is believed, (b) *closure under valid implication*, namely, if  $\phi \rightarrow \psi$  is valid and  $\phi$  is believed then  $\psi$  is believed and (c) *belief of valid formulas*, namely, if  $\phi$  is valid, then  $\phi$  is believed.

The agent in the classical model of knowledge [10] has all the undesirable properties (a), (b) and (c) above. Several improvements have been suggested, and they have been broadly classified as "syntactic" and "semantic" approaches. In the syntactic approach e.g. [5, 23], what the agent knows is represented by a set of formulas and hence is not constrained under consequence. But such approaches are difficult to analyze, since they are not guided by knowledge-based principles. A commendable syntactic approach is presented by Konolige in his *deduction model* [11] which gives a formal characterization of explicit beliefs and captures how agents syntactically derive new beliefs, possibly with an incomplete set of inference rules.

In contrast, semantic approaches attempt to give semantics similar in most cases to the possible world semantics, but with "fixes". Levesque [18] gives a semantic account of *implicit* and *explicit*

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<sup>1</sup>An active logic for fully deadline-coupled planning has several inference rules for planning with deadlines that are domain independent. These include inference rules for temporal projection and book-keeping, checking deadline feasibility, and plan formulation and execution. Domain specific axioms describe the particular instance of the planning problem. A limited-memory model that addresses two other resources of value: space and parallelism has been integrated into the deadline-coupled reasoning.

0 :	$\emptyset$	$\frac{i : \dots \alpha, \beta \dots}{i+1 : \dots \alpha \wedge \beta \dots}$	Conjunction
:			
$i :$	$\dots \alpha \dots$	$\frac{i : \dots \alpha \wedge \beta \dots}{i+1 : \dots \alpha \dots}$	Detachment
$i+1 :$	$\dots \alpha \rightarrow \beta, \beta \rightarrow \gamma \dots$		
$i+2 :$	$\dots \beta \dots$	$\frac{i : \dots \alpha \dots}{i+1 : \dots \alpha \dots}$	Inheritance
$i+3 :$	$\dots \gamma \dots$		
:		$\frac{i : \dots}{i+1 : \dots \alpha_{obs} \dots}$	Observation

Figure 1: Step-logic studies and Inference rules for an  $SL_{\mathcal{L}}$  logic

belief where implicit beliefs are the logical consequences of explicit belief. A solution to (a) and the possibility of having contradictory beliefs is achieved by introducing an artificial notion of *incoherent or impossible worlds*. Levesque's approach was subject to the criticism that an agent in the logic is a perfect reasoner in relevance logic. Levesque's ideas have been extended in [26] and [16]. Montague has given a possible world semantics that gets around problem (a) of logical consequence. We use the main idea in this model, namely, to define knowledge as a relation between a world and a set of sets of possible worlds. However, we provide the distinction of incorporating time-situatedness. Vardi [31] provides a co-relation between restrictions on models in the Montague semantics and the corresponding agent properties that they characterize.

Fagin and Halpern [8] have presented a series of interesting approaches to limited reasoning that marry the syntactic and semantic approaches. They provide an extension to Levesque's approach for the multi-agent case, and introduce a notion of *awareness*. They also provide an approach to local reasoning that they call a *society of minds approach*. Fagin and Halpern's awareness notion, in their logic of general awareness acts like a filter on semantic formulations. It has been evaluated and criticized in [12]. One of the criticisms is that the model is un-intuitive, since it is unlikely that an agent can compute all logical consequences, discarding the one's that it is not aware of, say, because of memory limitations, because in fact, agents are also affected by time limitations. There are a number of works that have considered logics of knowledge and time e.g. [28, 17, 13, 15, 2]. Fagin and Halpern discuss the possibility of capturing bounded and situated reasoning by letting the awareness set vary over time. However, no attempt has been made to systematically study and model situations where the passage of time is a critical issue.

### 3 The step-logic approach to reasoning

Step-logics [7] were introduced to model a commonsense agent's ongoing process of reasoning in a changing world. A step-logic is characterized by a language, observations and inference rules. A *step* is defined as a fundamental unit of inference time. Beliefs are parameterized by the time taken for their inference, and these time parameters can themselves play a role in the specification of the inference rules and axioms. The most obvious way time parameters can enter is via the expression  $Now(i)$ , indicating the time is now  $i$ . Observations are inputs from the external world, and may arise at any step  $i$ . When an observation appears, it is considered a belief in the same time-step. Each step of reasoning advances  $i$  by 1. At each new step  $i$ , the only information available to the

agent upon which to base his further reasoning is a snap-shot of his deduction process completed up to and including step  $i - 1$ . The left part of Figure 1, adapted from [6] illustrates three steps in a step-logic with Modus Ponens as one of its inference rules.

Elgot-Drapkin also characterized an array of eight step-logics in increasing order of sophistication with respect to three mechanisms : self-knowledge (S), time (T) and retraction (R)<sup>2</sup>. According to this classification,  $SL_5$  is the simplest dynamic deductive logic with time and self-knowledge capability, but no retraction mechanism (no ability to handle contradictions). An  $SL_5$  logic is a triple  $\langle \mathcal{L}, OBS, INF \rangle$  where  $\mathcal{L}$  consists of propositions (with the addition of time),  $OBS$  is an observation function describing inputs from the world at each step, and  $INF$  is a set of inference rules. We describe an  $SL_5$  step-logic to which we provide a modal active-logic analog. The set  $INF$  for it is shown in the right part of figure 1.

We have chosen the simplest  $SL_5$  since our main interest is in the treatment of time and in modeling agents with nested beliefs. We will impose an additional constraint on models that does not allow for contradictions in the agent's beliefs<sup>3</sup>.

## 4 A modal active-logic for reasoning *in* time

With  $SL_5$  as the motivation, we provide a time-situated modal logic. This modal logic is based on Montague's intensional logic of belief [22], that uses structures referred to in the literature as *neighborhood structures* or *minimal structures* [3]. They were first used in [21] and in [29]. Montague gives a possible world semantics to epistemic logic where, unlike in the classical model<sup>4</sup>, knowledge is defined as a relation between a world and a set of sets of worlds. An *intension* of a formula  $\phi$  denoted by  $||\phi||$  is the set of worlds  $w$  such that  $w \models \phi$ .

We prefer to use *timelines* instead of possible worlds, since this gives us a way to naturally incorporate time into our framework.  $L$  denotes the set of timelines [30]. We consider time lines that are restricted to be finite from one side and infinite from the other (i.e., are rays). At every time point in each timeline some propositions are true and the rest are false. In particular, there is one timeline of most interest, that captures the *real* history of occurrences in the world. We call this line  $l_h \in L$  the *history timeline*.

### 4.1 Syntax and semantics

In the logic proposed, the agent reasons in a propositional language with time. The interest is in sentences such as:

p: Nell is tied to the railroad tracks at 3 pm.

q: Dudley is at home at 3:30 pm.

<sup>2</sup> $SL_0$ :none;  $SL_1$ :S;  $SL_2$ :T;  $SL_3$ :R;  $SL_4$ :S,R;  $SL_5$ :S,T;  $SL_6$ : R,T; and  $SL_7$ :S,T,R.

<sup>3</sup>However, this condition may be relaxed if for example, we desire to model an agent with default reasoning capability. Step-logics are inherently nonmonotonic and allow for implicit and explicit contradictions in the agent's reasoning. The modal logic approach which is motivated by the step-logic work is powerful enough to deal with contradictions.

<sup>4</sup>The classical possible-worlds model is based on the idea that besides the true world, there are other possible worlds, some of which may be indistinguishable to the agent from the true world. An agent is said to *believe* a fact  $\phi$  if  $\phi$  is true in all the worlds that she thinks possible. A semantics based on Kripke structures for this classical model suffers from the well known drawback from the point of view of logical omniscience that  $K\phi \wedge K(\phi \rightarrow \psi) \rightarrow K\psi$  is an inherent axiom.

Formally, we assume that there is a set  $P$  of atomic propositions. Let  $\mathcal{N}$  denote the set of numerals, namely, “1”, “2”, “3”, etc. The relation “ $<$ ” denotes the normal total order on the set  $\mathcal{N}$ . We define  $PT = P \times \mathcal{N}$  as the set of propositions extended to include time constant arguments. The elements of  $PT$  are the atomic formulas of our language, and we will denote them as  $p(\tau)$  where  $p \in P$  and  $\tau \in \mathcal{N}$ . The language  $\mathcal{G}$  is the smallest set that contains  $PT$ , and is closed under the  $\neg, \wedge, \vee, \rightarrow$  connectives, and contains  $B_\tau \phi$  whenever  $\phi$  is in the language and  $\tau \in \mathcal{N}$ . The  $B$  operator denotes belief.<sup>5</sup> This language can easily be extended to include multiple agents, by the use of an additional parameter  $i$ , so that  $B_\tau^i \alpha$  denotes “at time  $\tau$  agent  $i$  believes in  $\alpha$ ”, where  $\alpha$  may include beliefs of other agents.

A structure in the proposed time-embedded active logic is:  $M = \langle L, \mathcal{N}, v, <, \pi, \mathcal{B} \rangle$  where

- $L$  is a set of timelines.
- $v(n \in \mathcal{N}) = n$  is the interpretation function for time point constants.
- $\pi : PT \times L \rightarrow \{true, false\}$  is a truth assignment to the formula  $p(t) \in PT$  for each timeline  $l, l \in L$  at the time point  $t \in \mathcal{N}$ . Thus  $\pi$  defines the intensions of the atomic formulas of our language.
- $\mathcal{B} : L \times \mathcal{N} \rightarrow 2^{2^L}$  is a belief accessibility relation, defined for each timeline, time point pair  $(l, t), l \in L, t \in \mathcal{N}$ .

We will use  $\mathcal{B}_t(l)$  to denote  $\mathcal{B}(l, t)$ , which is the set of sets of time lines related to  $l$  at time  $t$  through the  $\mathcal{B}$  relation. Note the use of the pair  $(l, t)$ . We are interested in epistemic behavior over time, and this is depicted by the evolution of beliefs (and the corresponding accessibility relations) from  $(l_h, t)$  to  $(l_h, t + 1)$  in the real timeline.

Analogous to the Montague intensional logic, we define  $B_\tau \phi$  to denote that an agent “believes a formula  $\phi$  at time  $\tau$ ” and define a satisfiability relation for timelines based on intensions. An intension of a formula  $\phi$  in a structure  $M$  denoted by  $\|\phi\|$  is  $\{l \mid l \in L, M, l \models \phi\}$ .

Figure 2 illustrates the neighborhood structures for our modal logic<sup>6</sup>.

We impose restrictions on models to reflect the step-like reasoning behavior between successive time instances. These restrictions make certain axioms sound in our system. We further characterize the modal active-logic by a sound and complete set of axioms and inference rules. Time is an essential resource in this framework and is consumed in the reasoning process. This logic captures the reasoning process of a non-omniscient resource-limited agent.

We formally define  $\models$  for the structure  $M = \langle L, \mathcal{N}, v, <, \pi, \mathcal{B} \rangle$  described above as follows:

1. This defines satisfiability of the atomic formulas of our language.  
 $M, l \models p(\tau)$  if  $\pi(p(\tau), l) = true$ .

<sup>5</sup>In this language one can express formulas such as  $p$  and  $q$  above, belief formulas such as  $B_{\tau_1} p(\tau_2)$  to mean “at time  $\tau_1$  the agent believes that  $p$  is true at time  $\tau_2$ ”, or nested beliefs formulas such as  $B_{\tau_1} (B_{\tau_1+2} p(\tau_2) \vee B_{\tau_1+2} q(\tau_3))$  to mean “at time  $\tau_1$  the agent believes that two time points later she will believe  $p(\tau_2)$  or she will believe  $q(\tau_3)$ ”.

<sup>6</sup>We comment here that it is possible to extend the modal active-logics to multiple agents reasoning in time. A structure for an active logic with multiple agents is  $M = \langle L, \mathcal{N}, v, \pi, \mathcal{A}, \mathcal{B}^1, \dots, \mathcal{B}^n \rangle$ .  $L$  is the set of time lines and  $\pi$  is the truth assignments to base formulas as before.  $\mathcal{A}$  is the set of agents  $\{1, \dots, n\}$ , and each of  $\mathcal{B}^i, i = 1, \dots, n$  associates with a timeline, time point pair  $(l, t)$ , a set of set of timelines that are belief-accessible from  $l$  at time  $t$  from the perspective of agent  $i \in \mathcal{A}$ . In problems such as the three wise men problem mentioned in the introduction, a multi-agent logic where the time of all agents increments synchronously can provide an elegant solution to the problem.

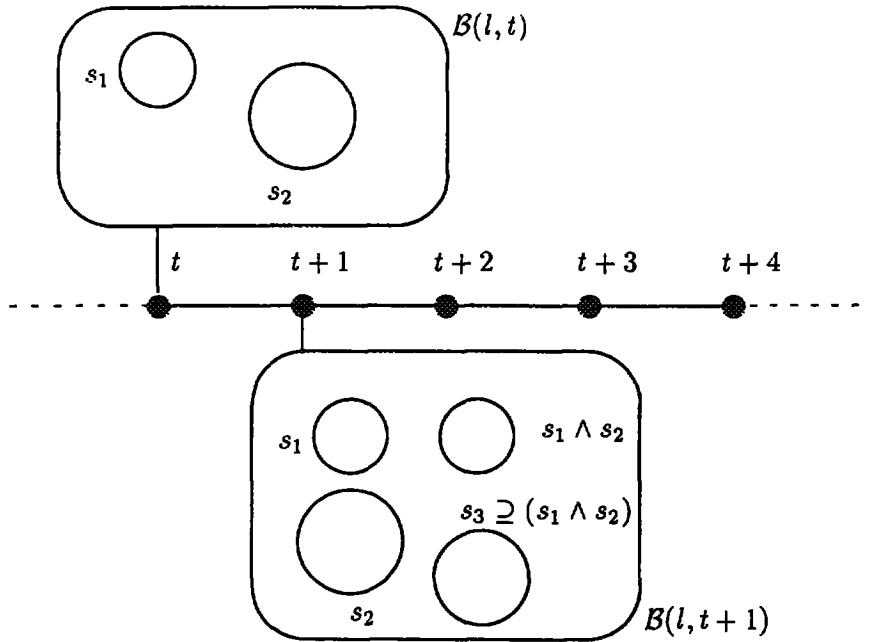


Figure 2: Neighborhood structures for the belief operator

2. This defines satisfiability of negated formulas.  
 $M, l \models \neg\phi$  iff  $M, l \not\models \phi$ .
3. This defines satisfiability of formulas formed with the  $\wedge$  connective.  
 $M, l \models (\phi \wedge \psi)$  iff  $M, l \models \phi$  and  $M, l \models \psi$ .
4. This defines the satisfiability of the belief formulas.  
 $M, l \models B_r\phi$  iff  $\|\phi\| \in \mathcal{B}_r(l)$

The satisfiability of  $\vee$  and  $\rightarrow$  is defined accordingly.

We impose the following restrictions on our models to describe an agent who reasons in a step-like fashion like its motivating step-logic agent described by  $SL_5$ .

- (C0)  $\forall l \in L, \|\text{true}\| = L \in \mathcal{B}_0(l)$ .

Since the set  $\mathcal{N}$  is ordered under  $<$ , and timelines are defined as rays, we can define a start point 0. This restriction says that the agent believes in *true* at the beginning of time. We note here that this restriction makes the axiom A0 (described in Figure 3) sound in the system. It also dictates that the agent always has a nonempty set of beliefs.

- (C1)  $\forall l \in L, \forall t \in \mathcal{N}, \{\} \notin \mathcal{B}_t(l)$ .

This says that the agent's belief set is consistent at every time point. As explained before, we introduce this restriction to model a simple agent without contradictory beliefs and without

*Axioms :*

(A0)  $B_0 true$ .

(A1) All tautologies of propositional logic.

(A2)  $\neg B_\tau false$ .

(A3)  $B_\tau \phi \wedge B_\tau \psi \rightarrow B_{\tau+1}(\phi \wedge \psi)$ .

Consistency  
Conjunction<sup>a</sup>

*Inference Rules :*

(R1) If  $\vdash \phi$  and  $\vdash \phi \rightarrow \psi$  then  $\vdash \psi$

Modus Ponens

(R2) If  $\vdash \phi \rightarrow \psi$  then  $\vdash B_\tau \phi \rightarrow B_\tau \psi$

Closure under valid consequence

(R3) If  $\vdash \phi$  then  $\vdash B_\tau \phi$

Belief in tautologies

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<sup>a</sup>Inheritance follows from (A3) when  $\phi = \psi$ .

Figure 3: Characterization of the modal active-logic

any mechanisms for retraction<sup>7</sup>.

- (C2)  $\forall l \in L, \forall t \in \mathcal{N}$ , if  $s_1 \in \mathcal{B}_t(l)$ , and  $s_2 \supseteq s_1$  then  $s_2 \in \mathcal{B}_t(l)$ .

This restriction says that a detachment of a belief is necessarily also a belief at the same time step (since supersets correspond to detachments in the step logic).

- (C3)  $\forall l \in L, \forall t \in \mathcal{N}$ , if  $s_1, s_2 \in \mathcal{B}_t(l)$ , then  $s_1 \cap s_2 \in \mathcal{B}_{t+1}(l)$ .

This restriction constrains models at successive time points to be one step richer than their predecessors, in the sense that the agent has added all possible pairwise conjunctions of previous beliefs to the current step, but each pair participates just once<sup>8</sup>.

## 5 Soundness and completeness proof for the modal active logic

**Theorem 1** : The set of axioms (A0–A3) and inference rules (R1–R3) in Figure 3 provide a sound and complete axiomatization of the modal active-logic for reasoning in time.

**Proof 1** (sketch) : Soundness follows in a straightforward fashion from the interpretation of  $\wedge$  and  $\neg$  in the definition of  $\models$  and from the restrictions on the models described. The proof of completeness hinges on the definition of a *canonical* model  $M^c$  in which every consistent<sup>9</sup> formula is satisfiable.

In  $M^c$  we have a timeline  $l_V$  corresponding to every *maximal consistent set*  $V$ . For definition and properties of maximal consistent sets we refer to [9]. Let  $I_\psi$  denote the set  $\{l_W \mid \psi \in W\}$ . The canonical model is defined as:  $M^c = \langle L^c, \mathcal{N}, v, <, \pi, \mathcal{B} \rangle$  where

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<sup>7</sup>This restriction can be relaxed if the intent is to model a fallible agent who does default reasoning and may be permitted to have contradictory beliefs at any given time. Without the above restriction the neighborhood structures possibly allow for both  $M, l \models B_\tau \phi$  and  $M, l \models B_\tau \neg \phi$ , since both  $\|\phi\|$  and  $\|\neg \phi\|$  could belong to  $\mathcal{B}_\tau(l)$ .

<sup>8</sup>For example, if  $M, l \models B_\tau \alpha$ ,  $M, l \models B_\tau \beta$  and  $M, l \models B_\tau \gamma$  then  $M, l \models B_{\tau+1}(\alpha \wedge \beta)$ ,  $M, l \models B_{\tau+1}(\alpha \wedge \gamma)$  and  $M, l \models B_{\tau+1}(\beta \wedge \gamma)$  but  $M, l \models B_{\tau+1}(\alpha \wedge \beta \wedge \gamma)$  does not follow from this restriction, however  $M, l \models B_{\tau+2}(\alpha \wedge \beta \wedge \gamma)$  does.

<sup>9</sup>A formula  $\phi$  is *provable* if  $\phi$  is one of the axioms or follows from provable formulas by application of one or more inference rules. A formula  $\phi$  is *consistent* if  $\neg \phi$  is not provable.

$L^c = \{ l_V : V \text{ is a maximal consistent set } \},$   
 $\pi(p(\tau), l_V) = \text{true}$  iff  $p(\tau) \in V$ , and

For  $t \in \mathcal{N}$ ,  $\mathcal{B}_t(l_V) =$   
 $\{ I_\psi \mid B_t\psi \in V \} \cup \{ S \mid S \supseteq S', S' \in \{ I_\psi \mid B_t\psi \in V \} \text{ and } \forall \psi, \psi \in \mathcal{G} \rightarrow S \neq I_\psi \}.$

We then prove using induction that  $M^c, l_V \models \phi$  iff  $\phi \in V$ , which proves that all consistent formulas are satisfiable in this structure. We provide the details of the proof in the full paper.

## 5.1 Discussion

Active logics capture the process of reasoning of a resource-limited agent as it goes on in time. As time progresses, the agent draws more inferences (new beliefs) at each time step. Thus, an agent does not draw all the consequences of its current set of beliefs  $\Sigma$  all at once, but continues to add conclusions to this set in accordance with a set of inference rules. This is reflected by the increasing size of  $\mathcal{B}(l_h, t)$ , where  $l_h$  denotes the *real* history of occurrences in the world, and  $\mathcal{B}(l_h, t)$  reflects what the agent believes in time  $t$ . The agent is certainly not guilty of omniscience under (a) logical consequence<sup>10</sup> since it is trivial to provide a counter-model to  $B_\tau\alpha \rightarrow B_\tau(\alpha \rightarrow \beta)$ ,  $\neg B_\tau\beta$ . By virtue of a description that is based on *intensions* of formulas, it is difficult to distinguish between semantically equivalent beliefs. As such, (c) belief of valid formulas and (b) closure under valid consequence follows.

However, it is possible to modify our logic by providing a syntactic way to curtail the size of the belief set by introducing an additional element  $G$  to the structure  $M$ .  $G \subseteq \mathcal{G}$  is defined as the agent's language and is closed under subformulas. An agent believes in  $\psi$  (i.e.,  $B_\tau\psi$ ) only if  $\psi \in G$ . For this new structure, the set of axioms and inference rules are suitably modified to capture this change (e.g., in (A3)  $\phi \wedge \psi \in G$  and in (R3)  $\phi \in G$  is added) and appropriate restrictions are placed on  $M$ . In essence,  $\mathcal{B}_t(l)$  sets are filtered by  $G$  for all  $t$  and  $l$ . It can be proven that the modified set of axioms and inferences are sound and complete with respect to the modified structure. If the model includes more than one agent, each of them may have a different language  $G$ . This restricts an agent who believes in  $\phi$ , to only that subset of  $[\phi]$  (the equivalence class of  $\phi$ ) which is in the agent's language. The agent also believes only those tautologies that are in  $G$ . Hence the scope of (b) and (c) is reduced in the modified structure. The agent's language  $G$  has similarities to the awareness set concept of [8]. If one considers multiagent belief operators  $\mathcal{B}^i$  without a time parameter then a modified version of Axiom (A2), and rule (R3) from figure 3 are true in the model of local reasoning of [8], (without modalities for implicit belief). Note, that we have only *explicit* beliefs, and there is no notion of *implicit* beliefs. In [8] the models are still static, in that even though they suggest incorporating reasoning *about* time, and *changing* awareness functions, there is no way to account for inference time in their models.

To summarize, the introduction of syntactic restrictions to the modal active-logic that reduces the scope of (b) and (c), decreases the gap between active-logic and modal-logics, but doesn't close that gap, i.e. the agent still knows all tautologies that are in its language or non of them. There are other small differences between active logic and modal active logic, such as the introduction of observation or believes in contradictory sentences that is possible in some versions of active logics.

<sup>10</sup>The agent may eventually compute all logical consequences of its belief set if it has a set of complete agent inference rules.



This differences can be taken care of by simple modifications of the modal-active logic. We will discuss this in the full paper.

## 6 Logic of Focus of Attention

One of the main shortcomings of the original step-logics is the unrealistic parallelism: it was assumed that during a given step  $i$  the agent can apply all available inference rules in parallel, to the beliefs at step  $i-1$ . However, this is an unrealistic amount of parallelism that potentially allows the agent to draw so many inferences in one time step that the meaning of what constitutes a step begins to blur. The unrealistic parallelism is also reflected in the modal active-logic presented in the previous sections: we don't restrict the number of detachments that can be done in the same time.

In [25] a short-term memory was introduced in the formalism of active-logic to handle the problem of the unrealistic parallelism in the original step-logic. In this section we extend the modal active-logic and provides formal framework to study heuristics for limiting the number of inferences an agent can perform in each time unit.

The main intuition behind the extension of the formalism is that an agent doesn't draw conclusions based on all of its beliefs. In each time period only some of its beliefs are in focus and it performs inferences only on such beliefs. For example, it may be the case that agent believes  $\alpha \rightarrow \beta$  and believes  $\alpha$ ; however, if one of these beliefs is not in the agent's focus, it won't conclude, in the next time step, that  $\beta$  is true. Only when, at some later time, both formulas will enter the focus of attention of the agent in the same step, it will conclude  $\beta$ .

We extend our language with an additional modal operator  $F$  to capture focus of attention. Thus, if  $\phi$  is in the language and  $\tau \in \mathcal{N}$  then  $F_\tau\phi$  is in the language. We also extend the modal active-logic structure by adding a new accessibility relation,  $\mathcal{F} : L \times \mathcal{N} \rightarrow 2^{2^L}$  defined for each timeline, time point pair  $(l, t), l \in L, t \in \mathcal{N}$ . We will use  $\mathcal{F}_t(l)$  to denote  $\mathcal{F}(l, t)$ , which is the set of sets of time lines related to  $l$  at time  $t$  through the  $\mathcal{F}$  relation. The satisfiability of a focus-of-attention formula is defined similarly to the definition of beliefs formula:  $M, l \models F_\tau\phi$  iff  $\|\phi\| \in \mathcal{F}_\tau(l)$ .

We modify the restrictions that were imposed on the modal-active logic models, to describe an agent that has limited span (focus) of attention. Restrictions (C0) and (C1) are as in Section 4.1. Restrictions (C2) and (C3) are modified and are denoted by (CF2) and (CF3). In addition we add three restrictions.

- (CF2)  $\forall l \in L, \forall t \in \mathcal{N}$ , if  $s_1 \in \mathcal{F}_t(l)$ , and  $s_2 \supseteq s_1$  then  $s_2 \in \mathcal{B}_{t+1}(l)$ .

This restriction says that detachment of a belief is only done on beliefs that are in the focus of the agent and that detachment takes at least one time step.

- (CF3)  $\forall l \in L, \forall t \in \mathcal{N}$ , if  $s_1, s_2 \in \mathcal{F}_t(l)$ , then  $s_1 \cap s_2 \in \mathcal{B}_{t+1}(l)$ .

This restriction constrains models at successive time points to be one step richer than their predecessors as in (C3). However, the agent adds only pairwise conjunctions of previous beliefs that are in focus to the current step. As in (C3) each pair participates just once.

- (CF4)  $\forall l \in L, \forall t \in \mathcal{N}$ ,  $\mathcal{F}_t(l) \subseteq \mathcal{B}_t(l)$ .

The agent believes all the formulas that are in its focus. That is, the set of the formulas that are in the agent's focus of attention are subset of its beliefs.

- (CF5) If  $s_1, s_2 \in \mathcal{F}_t(l)$  then  $s_1 \cap s_2 \neq \emptyset$ .

This restriction is introduced to prevent contradictory beliefs to be under the agent's focus of attention at the same time.<sup>11</sup>

- (CF6)  $\forall l \in L, \forall t \in \mathcal{N}, B_t(l) \subseteq B_{t+1}(l)$ .

This says that the agent inherits beliefs from one time instance to the next.<sup>12</sup>

Axioms (A0)-(A2) and rules (R1) and (R3) are still sound in the new framework<sup>13</sup>. However, (A3) and (R2) are not sound in the new framework. First, we need to modify axiom (A3) to reflect that an agent can make inferences only on beliefs that are in its focus of attention:

$$(AF3) F_\tau \phi \wedge F_\tau \psi \rightarrow B_{\tau+1}(\phi \wedge \psi).$$

Inheritance doesn't follow from (AF3). Therefore, we need to introduce a new axiom:

$$(AF4) B_\tau \phi \rightarrow B_{\tau+1} \phi$$

We also introduce additional axiom to capture the relationships between the agent's beliefs and its focus of attention.

$$(AF5) F_\tau \phi \rightarrow B_\tau \phi$$

We need also to weaken (R2) since only the beliefs that are under focus are closed under consequences.

$$(RF2) \text{ If } \vdash \phi \rightarrow \psi \text{ then } \vdash F_\tau \phi \rightarrow B_{\tau+1} \psi$$

The weakening of (R2) requires additional inference rule that was redundant in the original framework. It indicates that if an agent believes  $\phi$  and  $\phi$  is equivalent to  $\psi$  then the agent believes in  $\psi$ .<sup>14</sup>

$$(RF4) \text{ If } \vdash \phi \leftrightarrow \psi \text{ then } \vdash B_\tau \phi \leftrightarrow B_\tau \psi \text{ and } \vdash F_\tau \phi \leftrightarrow F_\tau \psi$$

It is easy to show that the above axioms and inference rules are sound for the models of modal active-logic with the focus of attention. The issue of completeness is still an open question.

The most interesting question is how the set of beliefs that are under the span of attention of the agent is changing over time. Different agents may have different heuristics for bringing formulas to their focus. It depends of their resources and computation capabilities; our framework

<sup>11</sup>This restriction is introduced to model a simple agent without any mechanism for handling contradictory beliefs.

<sup>12</sup>Note, that in Section 4.1, (CF5) follows from (C3). If we allow an agent to have conflicting formulas under its focus, (i.e., remove restriction CF5), we will need to modify restriction (CF6) to reflect the agent mechanisms for retraction of contradictory beliefs.

<sup>13</sup>The introduction of the language  $G$  into the framework, as was suggested in Section 5.1 will require modification of (R3) too: agent will believe only in tautologies that are in its language.

<sup>14</sup>The introduction of the agent's language  $G$  to the system as was suggested in Section 5.1 will reduce the affect of this rule; the agent will believe  $\psi$  only if  $\psi$  is in its language.

is appropriate for studying the properties of such heuristics and we will present several examples in the full paper.

Another issue that can be studied in our framework is adding more restrictions on of the number of detachments an agent can perform in each step. While the introduction of focus of attention limits the parallelism in the agent reasoning, we still allow in (CF2) to any number of detachments of beliefs that are in the focus. It is possible to further modify (CF2) by restricting the size of the sets  $s_2 \supseteq s_1$  that are added to  $\mathcal{B}_{t+1}(l)$ . Different restrictions will reflect different heuristics for performing inferences. We will demonstrate it in the full version.

## 7 Conclusions

In this paper we presented a modal active-logic that account for some aspects of the passage of time as the reasoning occurs. We characterized the system by providing a sound and complete axiomatization. In order to avoid unrealistic parallelism of the agent's reasoning, we introduced the notion of a focus of attention and discussed possible properties of such system. This framework is appropriate for studying the properties of such heuristics for performing inferences. An open problem is to find a sound and complete axiomatization for the modal active-logic with focus of attention.

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