

Temporal Event Conceptualisation

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Abstract

This paper describes a system that performs Temporal Event Recognition, i.e., the task of forming causal and conceptual descriptions of stimuli given to a system over a period of time. A temporal logic that integrates state based and interval based representations is used to represent and maintain knowledge about the temporal relationships between events. A knowledge based system is then constructed that uses this temporal knowledge to generate higher level conceptual abstractions that describe the events occurring at the input. An implementation of the system called MUSE is described and examples of the system working in a Blocks world are presented.

1. Introduction

In this paper we study the problem of Temporal Event Recognition, i.e. forming causal, conceptual descriptions of discrete, uninterpreted stimuli to a system. This problem has been studied both directly and implicitly, by many researchers in Psychology [Miller&Johnson-Laird'73], Behavioral science [Newtson'73], and Artificial Intelligence [Schmidt,Sridharan&Goodson'78]. In AI research the problems of goal based story understanding and plan recognition [Wilensky'83] and the work of (Tsuiji'77) on understanding cartoon films implicitly address this task. However, most of these systems are concerned with the specifics of the domain they seek to interpret and the management of temporal information is only peripherally addressed in these systems.

Recent work by [McDermott'82], [Allen'84] and others has concentrated on providing formal deductive representations for temporal knowledge and they have developed extensive general theories of time. [Borchardt'85] is one of the first attempts to bring these works together and the Event Calculus developed by him is directly related to the kinds of representations we try to develop in this paper. The work of [Thibadeau'86] is also similarly motivated though his work is more oriented towards simulating human performance in action perception.

Our intent is to develop a domain independent framework in which event conceptualization may be performed. The basic paradigm we consider is the following. The system is presented with a set of stimuli at discrete instants. The task is to form a conceptual description of abstract events occurring in these instants and to provide a causal interpretation of these stimuli.

The overall framework presented in this paper has been implemented in an event recognition program on a Symbolics 3670. The paper that follows is a description of the theory behind this system, which we call MUSE. The paper is organized as follows. Section 2, briefly discusses the temporal logics of [McDermott'82] and [Allen'84] and argues that while both of them have useful properties neither is completely adequate for the task at hand. Sections 3 to 5 then present an alternate hybrid representation and discuss its properties and develop the basic structure of the event recognition system. Section 6 gives an example of the system working in the Blocks world.

A longer version of this paper [Kumar&Mukerjee'87] contains a more complete account of the motivations behind this work and the implementation details of our system. The reader is referred to that report for additional information.

2. Representing Temporal Knowledge

Recent work on temporal reasoning has given rise to two basic symbolic models of time. In one approach, (for example, [McDermott'82]) the basic unit of time is an atemporal entity called a *state* or an *instant*. In the second approach [Allen'84] [Allen'85] [Ladkin'86] the basic unit is the *interval*, which represents a finite "chunk" on some

time line. In the state based approach, the passage of time is represented using a partial ordering between states. Intervals of time are thus represented using sets of states in this approach. Intervals are first class entities in the second approach and here points are defined using intersections of intervals [Allen'86]. The following discussions assume that the reader is familiar with the basic features of both these models. Space considerations preclude a detailed analysis of the comparative merits of the two models. Below we outline briefly the motivations behind our choice of representation. The reader is referred to the longer version of this paper for a detailed comparison.

We are primarily interested in representing temporal information about *events*. In state based systems events are defined indirectly as facts that are true over sets of consecutive states. Thus temporal relations between events can be determined by examining the respective set of states. In interval based systems on the other hand, events can be directly associated with intervals and the temporal relationships between events can be directly expressed by the interval relationships (say for example, of [Allen'84]). Thus intervals are powerful source of temporal abstraction in representing information about events. However, intervals are awkward to use for global or situational information. If, for instance, we wish to know what facts are true at a particular point in time, the interval notation is awkward to use since such information has to be derived by pairwise comparison of events using binary relations between them. In typical event recognition problems, the input information is usually global and consists of descriptions that hold at various points in time. Thus a direct use of the interval logic is inconvenient.

Another major problem with the interval notation is that intervals require both a starting point and ending point to be completely defined. All the temporal relationships of [Allen'84] require that the two intervals be completely defined. This means that temporal relations between incomplete intervals cannot be expressed using this notation. As we show in the longer paper none of the relationships can be automatically derived until a time when at least one of the events has terminated. This means that we cannot build an incremental temporal reasoner that deals with ongoing events using the interval logic.

In this paper we show that the above problems can be solved if we re-interpret the interval notation using a state based approach. In particular we show how these relationships can be automatically derived using strictly local deductions from situational information. We thus end up with a hybrid representation which uses states to encode global information and constructs intervals implicitly by deriving interval relationships between facts in the states. We thus gain the advantages of the "world centered" state space approach and the "event centered" interval approach.

3. Basic Definitions

In our representation factual world knowledge is represented by two sets of propositions P_r and P_d . P_r is a set of *primitive propositions* from which all inputs to the system are drawn. P_d is a set of *derived propositions* such that $P_d \cap P_r = \emptyset$ (the null set). Intuitively, the task of temporal event conceptualisation involves defining a mapping between the two sets such that the elements of P_r may be re-expressed in terms of those in P_d . We define the set $V = P_r \cup P_d$.

Time is represented by a linearly ordered set of states S . A function $ll(u, a)$ which ranges over the set $\{true, false\}$ determines the truth values of a proposition $P \in V$ at a specific instant $r \in S$. The set of states in S is utilised to provide a frame of reference for describing events in a domain. We thus place a restriction on this set that it be of a sufficiently high "resolution" i.e. For all $\langle p \in V$, if p is true over a set of instants $\{a_1, \dots, a_k\}$ and if it becomes false at a_{k+1} then $a_{k+1} \in S$. Similarly, if a is false over a set $\{o-1, \dots, a_k\}$ and becomes true at 0_{k+1} , then $o_{k+1} \in S$. The above restriction places a minimal bound on the resolution of the set S required to perform event conceptualisation

using our representation.

An event is a tuple (φ, τ) where $\varphi \in \mathcal{P}$ and $\tau \subset \mathcal{S}$ such that $\Pi(\varphi, \sigma)$ is true for all $\sigma \in \tau$. The set τ is restricted to contain only consecutive elements of \mathcal{S} , i.e., if $\sigma_i \in \tau$, then either $\sigma_{i+1} \in \tau$, or $\sigma_i \notin \tau$ for all $k > i$. An event is defined as a primitive event if $\varphi \in \mathcal{P}_1$ and a derived event if $\varphi \in \mathcal{P}_2$. An event is said start at a particular instant if the corresponding proposition becomes true at that instant. Similarly it said to terminate at an instant if the proposition becomes false at that instant.

The set τ is called the extent of the event. We will also refer to this set as the duration of the event or the interval associated with the event. The events (φ, τ_1) and (φ, τ_2) are considered distinct if $\tau_1 \neq \tau_2$.

4. Deriving Temporal Assertions

Syntactically, a temporal assertion is a logical sentence of the form $\varphi_1(\tau) \varphi_2, \varphi_1, \varphi_2 \in \mathcal{P}$, and $\tau \in \{= > < \text{ in } \text{m} \text{ i} \text{ o } \text{ f } \text{ f } \text{ l } \text{ s } \text{ m } \text{ i } \text{ d } \text{ d } \text{ s} \text{ a } \text{ s} \text{ b } \text{ s} \text{ s } \text{ f } \}$. In the enumerated relationships above the first thirteen are identical to Allen's relationships. The remaining four relations, required to represent temporal relationships between incomplete events, are one of the extensions suggested by our work. This is discussed further below. We define the set \mathcal{R} as the set of all possible relations of this form for all $\varphi \in \mathcal{P}$ and the set \mathcal{R}^* as the closure of \mathcal{R} under the logical operations \vee and \wedge .

Although the temporal assertions in our representation are syntactically similar to Allen's the interpretation is quite different. In Allen's terminology, the primitives define relations between two completely specified intervals. In our terminology the primitives are used to make statements about what is known about the temporal relationships between two events at any instant $\sigma \in \mathcal{S}$. They may thus be viewed as propositions that hold at certain instants. The sentence characterising the relationship between two events change within the duration of the events. This is discussed below.

Due to dynamic changes in the world being modelled, at any instant in \mathcal{S} , some subset of \mathcal{P} may transition from false to true thus creating events and some other subset may transition from true to false thus terminating some events. We use the three predicates *Starts*, *Ends*, *Cont* to indicate the status of any event at an instant. Given an event $\eta = (\varphi, \tau)$ and any instant $\sigma_i \in \mathcal{S}$ we define

$$\begin{aligned} \text{Starts}(\eta, \sigma_i) &\equiv \text{Holds}(\neg\varphi, \sigma_{i-1}) \wedge \text{Holds}(\varphi, \sigma_i), \\ \text{Ends}(\eta, \sigma_i) &\equiv \text{Holds}(\varphi, \sigma_{i-1}) \wedge \text{Holds}(\neg\varphi, \sigma_i), \\ \text{Cont}(\eta, \sigma_i) &\equiv \text{Holds}(\varphi, \sigma_{i-1}) \wedge \text{Holds}(\varphi, \sigma_i). \end{aligned}$$

In this paper we use the literal *Holds* to represent the fact that a proposition is true at certain instant.

In this situation, at any given instant, all the propositions which are true will correspond to events whose beginnings are known. However, this may not, in general, be true for their endings. All of Allen's relationships require that at least one of the events have terminated. In order to express the temporal relationships between incomplete events we introduce four more relationships to this set. Three of these are shown in figure 1.

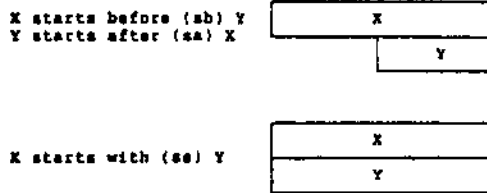


Figure 1.

A fourth relationship \emptyset (null) can be added to the set to express the relationship between an event and a (fictitious) event whose proposition happens to be false at that instant. Alternatively, we may view this assertion as expressing the relationship between an event and another, whose starting point is unknown.

With this expanded set of relationships, at any instant $\sigma \in \mathcal{S}$, there is a unique temporal assertion relating every pair of events corresponding to the propositions in \mathcal{P} . Each of these temporal assertions is computed by a strictly local deduction, depending on the truth value of the proposition at that instant and the instant immediately preceding it. We may express these deductions in terms of the inference rules below.

The simplest cases are derived first

$$[\text{Starts}(\eta_1, \sigma) \wedge \text{Starts}(\eta_2, \sigma) \Rightarrow \text{Holds}((\eta_1 \text{ s} \eta_2), \sigma)]$$

$$[\text{Starts}(\eta_1, \sigma) \wedge \text{Cont}(\eta_2, \sigma) \Rightarrow \text{Holds}((\eta_1 \text{ sb} \eta_2), \sigma)]$$

$$[\text{Cont}(\eta_1, \sigma) \wedge \text{Starts}(\eta_2, \sigma) \Rightarrow \text{Holds}((\eta_1 \text{ sa} \eta_2), \sigma)]$$

$$[\text{Starts}(\eta_1, \sigma) \wedge \text{Ends}(\eta_2, \sigma) \Rightarrow \text{Holds}((\eta_1 \text{ m} \eta_2), \sigma)]$$

The relationships *sa*, *sb*, and *ss* are only temporary relationships that will change when either of the two events terminate. When that happens the relationship is completely determined. Some of the rules that guide this transition are given below.

$$[\text{Holds}((\eta_1 \text{ s} \eta_2), \sigma) \wedge \text{Ends}(\eta_1, \sigma) \wedge \text{Cont}(\eta_2, \sigma) \Rightarrow \text{Holds}((\eta_1 \text{ s} \eta_2), \sigma)]$$

$$[\text{Holds}((\eta_1 \text{ s} \eta_2), \sigma) \wedge \text{Ends}(\eta_1, \sigma) \wedge \text{Ends}(\eta_2, \sigma) \Rightarrow \text{Holds}((\eta_1 = \eta_2), \sigma)]$$

$$[\text{Holds}((\eta_1 \text{ sa} \eta_2), \sigma) \wedge \text{Ends}(\eta_1, \sigma) \wedge \text{Ends}(\eta_2, \sigma) \Rightarrow \text{Holds}((\eta_1 \text{ f} \eta_2), \sigma)]$$

$$[\text{Holds}((\eta_1 \text{ sb} \eta_2), \sigma) \wedge \text{Cont}(\eta_1, \sigma) \wedge \text{Ends}(\eta_2, \sigma) \Rightarrow \text{Holds}((\eta_1 \text{ d} \eta_2), \sigma)]$$

$$[\text{Holds}((\eta_1 \text{ sb} \eta_2), \sigma) \wedge \text{Ends}(\eta_1, \sigma) \wedge \text{Cont}(\eta_2, \sigma) \Rightarrow \text{Holds}((\eta_1 \text{ o} \eta_2), \sigma)]$$

The remaining assertions can be derived similarly. The above rules can be concisely summarised in the state transition diagrams in

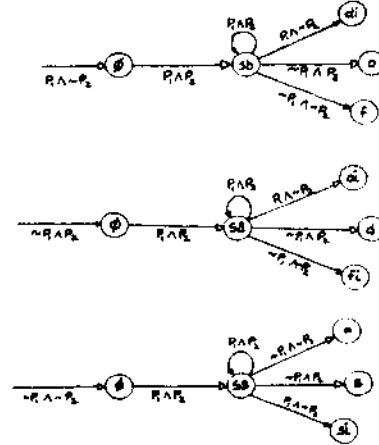


Figure 2.

Conceptually, we may imagine that the state transition diagrams represent finite state automata that monitor the logical relationships between each pair of propositions $(\varphi_1, \varphi_2) \in \mathcal{P}$. At each instant, each possible logical relationship is evaluated and if any of them evaluates to true then the arc of the corresponding transition graph is traversed and the node that is reached represents the current assertion that can be made about the temporal relationship between the two events corresponding to the propositions.

We define the logical prerequisite L of an assertion to be the label of the arc that would have to be traversed in order to reach the node representing that assertion. This concept will be used to define the notion of the scope of an assertion.

The scope of a temporal assertion linking two events (φ_1, τ_1) and (φ_2, τ_2) is the set

$$\{\sigma \mid \sigma \in (\tau_1 \cup \tau_2) \text{ and } \Pi(L, \sigma) \text{ is true.}\}$$

and L is the logical prerequisite of the assertion.

The scope of a conjunction of temporal assertions is the smallest complete interval that includes every point in intersection set of the scopes of the assertions. The smallest complete interval that includes the points $\sigma_i, \sigma_k \in \mathcal{S}$, $i < k$ is the set $\{\sigma_j, \sigma_j \in \mathcal{S} \text{ and } i \leq j \leq k\}$. The scope of a disjunction of assertions is the union of their scopes.

The definition of the scope of temporal assertions is a feature that distinguishes our interpretation of the temporal relationships from Allen's. In our representation, a temporal assertion between two events remains valid only as long as at least one of the events is active (i.e. the corresponding proposition is true). For example, an assertion $\eta_1(\text{m})\eta_2$ will become active if for some instant σ , η_1 ends and η_2 starts at σ . The scope of this assertion will include σ and all

the following instants at which life is active. Once n_2 ends, however, this assertion no longer holds.

5. Derived Events

We view temporal event conceptualisation as a process of temporal abstraction. This involves aggregating a set of events that occur in a certain sequence into a single abstract event. Such abstract events are called derived events in our representation. These are events whose occurrences are totally constrained by the occurrences of other events. The temporal assertions of the previous section define the allowable temporal constraints between events.

Formally, we represent a derived event by a statement of the form

$$\psi \models A$$

where A and w are formulas that may contain Quantified variables, such that some ground instance of A belongs to N , and some ground instance of w belongs to P_{dir} . Variables quantified over the entire expression are prefixed with a "q". The previous definition of a temporal assertion as a proposition allows us to evaluate the truth value of A at any instant.

The extent r of the derived event is defined as being equal to the scope of the constraining assertion A .

The final notion that needs to be defined is the idea of *Temporal Semantics* for events. In deriving abstract events as shown above, we must consider not only how they are conceptualised, but also the points of time at which they are said to be occurring. So far, it has been implicitly assumed that the extent of an event is also the period of time for which the event occurs. While this holds true for primitive events, this definition is too restrictive for derived events. In many cases, simply assuming that an event occurs when the corresponding proposition becomes true and ends when the proposition becomes false leads to descriptions of events that are rather counter-intuitive. Let us consider some examples below.

Consider an event *Going-from-College-Station-to-Austin*. The event itself is not realised until the agent has reached Austin, and yet, once it has reached Austin, the agent is no longer going from College Station to Austin. If we were to use the *extent* to report the period of time at which the event occurred then the event would activate the time longer at Austin. This is certainly not the period for which he was no longer at Austin. This is certainly not the period for which he was no longer at Austin. This is certainly not the period for which he was no longer at Austin. For this event we would like to use the fact that the agent reached Austin as confirmation of the fact that it was going to Austin but would like to adjust the set of instants at which the event was presumed to occur to include only those points at which the agent was on the road from College Station to Austin.

Another case that is possible is one of *Instantaneous actions*. Consider, for example the action of dropping a ball. We may say that someone drops a ball if he is initially holding the ball and then he opens his hand, thus releasing the ball. If we were to represent this situation using a derived event that was constrained by the events "holding" and "opening" then, the "dropping" action would, by the above scope rules, imply that the ball is being dropped at all instants that the hand remains open. However, this is not the way we perceive the dropping action. Effectively, the agent is said to drop the ball only at the instant when the hand opens.

It can be seen from the above examples that in practice the mapping to intuitive descriptions can be extremely complex and the simple notion of extent cannot account for many types of events. Thus, we need additional mechanisms that will allow us to make these distinctions. The idea of associating a descriptor with an event that will allow the computation of the period for which the event is active is our approach to providing a partial solution to this problem. We do not claim that this technique can account for all possible situations, but the methods outlined below are quite powerful and provide a means for "customising" the temporal semantics of an event.

Suppose we have a function $p(\eta)$, and $\eta = (\varphi, \tau)$ is an event. For any event, p returns a unique set of instants $\Theta \subset S$ associated with the event as defined below

$$p(\eta) = \begin{cases} \tau & \text{if } \varphi \in P_1; \\ \tau \cup \{ \cup_{n,1A} p(\eta_n) \} & \text{if } \varphi \in P_2 \text{ and } \varphi \models A. \end{cases}$$

N, A is an abbreviation for "every η such that η is an event whose corresponding proposition is a subformula of A ".

For a derived event the set Θ will, by the above definition, contain every instant from the starting point of the earliest primitive event that was involved in an assertion constraining that event to the termination point of the event. In effect this set may be thought of as a universal set of all the instants which may have some relationship to this event.

For primitive events Θ is the same as the extent of the event.

We can now define the Action Definition set α of an event to be those instants for which the action defined by the event is said to be performed. In specifying the temporal semantics of an event we will be specifying the action definition set of the event. Let us consider some examples.

The simplest case, where the action definition set is the same as the extent may be specified by $\alpha = \tau$. This defines the semantics of primitive events and any derived event for which it is appropriate. Such an event is said to have *Durational semantics*. The default semantics of all events in our representation is durational.

The second type of semantics, called *Abstraction semantics* is extremely useful in describing events which are goals or form the rationale for performing some set of lower level events. The action definition set includes the instant when the earliest event leading to it is activated and ends at the instant the event itself was started (ie. the goal was achieved). Examples of this type include the earlier event of going from College Station to Austin. We specify this type of event by $\alpha = \Theta \setminus \tau$, being the set difference operation.

Instantaneous semantics may be defined by $\alpha = \min(\tau)$ ie. the action is defined at the first instant of the extent.

The notion of defining event semantics in this way is thus a very useful one because it allows us a certain flexibility in reporting the occurrence of events. We have only scratched the surface of a complex problem however, and much work needs to be done in formalising and generalising this principle to handle much more complex cases.

With the above framework, we can now take up a concrete example of an event recognition system. This is considered in the next section.

6 An Event Recognition Example

In this section, we describe briefly, the basic premises behind MUSE as an event recognition system and provide some concrete examples of the ideas discussed in the previous sections. Due to space restrictions the example discussed is extremely simple. Specific implementation details can be found in the longer version of the paper.

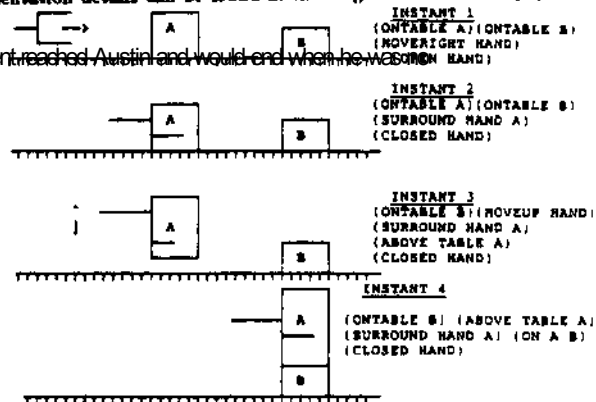


Figure 3.

MUSE takes as its input low level propositional descriptions of a hypothetical scene. In the blocks world example which will be considered here, the scene consists of a number of blocks on a table and a set of agents (hands) which are performing some actions in this world. The task given to MUSE is to provide a high level description of the actions of the agents. The input is provided in a series of snapshots of the world at various instants. As an example consider the sequence of situational descriptions in Fig 3 that are presented to MUSE.

Each of these instantaneous descriptions naturally map on to the states in our model. The propositional descriptors primarily describe positions and motions of the agents and the blocks. Thus we have descriptions like *Ontable(A)*, *On(B,A)*, *Move-right (Hand)*, etc. Our premises here are somewhat similar to [Miller&Johnson-Laird'76] though at a slightly higher level of abstraction in the primitives assumed.

MUSE takes this set of situational descriptions and produces the higher level description of Fig 4.

High level descriptions are represented by derived events which are constrained to occur when certain sequences of low level events occur. They include *Grasp*, *Pick-up*, *Move-holding*, *Puton*, etc. Thus an event like *Grasp* would be described as follows

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==> (GRASP HAND A) at INST_2
==> (PICKUP HAND A) at INST_3
==> (MOVEHOLDING HAND A) started at INST_3
==> (MOVEHOLDING HAND A) ended at INST_4
==> (PUTON HAND A B) from INST_2 to INST_4

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Figure 4.

$Grasp(?x ?y) \models (Move(?x) (m) Surround(?x ?y) \wedge (Surround(?x ?y) (sb) Closed(?x)))$

Here $?x ?y$ are variables that may be instantiated by the Hand and some Block in a specific case. This definition compactly defines the fact that the hand may be presumed to grasp the block if a motion of the hand ends with the hand surrounding the block and consequently the hand closes. Besides defining the action itself the scope and extent of the action may be determined from the above definition using the scope of the assertion on the RHS. This may be graphically described as shown below.

In figure 5, the thin boxes represent assertions and the points at which they remain valid. Since the *Grasp* event is defined as a conjunction of temporal assertions, it is activated when both assertions are activated, i.e. at t_2 . The scope of the (m) assertion is the same as the extent of the surround event. The scope of the (sb) assertion is the intersection of the scopes of the *Surround* and *Closed* events, i.e. when either the *Surround* or *Closed* events ends the assertion becomes false, and the relationship between the two events will change according to the rules and transition diagrams of section 3. Thus the extent of the *Grasp* event is the intersection of the scopes of the two assertions and this ensures that the hand is seen to be grasping the block as long as both the *Surround* and the *Closed* events are active.

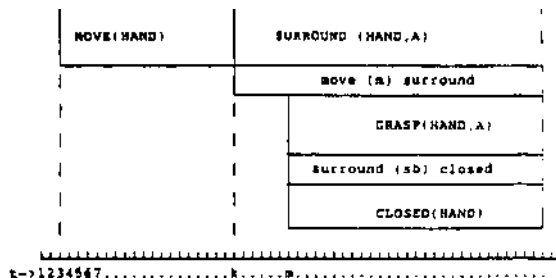


Figure 5.

Presumably, if the hand is no longer surrounding the block then the block has slipped through the hand and if it is no longer closed then the hand may have released the block. This may be represented as

$Slip(?x ?y) \models Grasp(?y ?x) (f) Surround(?y ?x)$

and

$Release(?x ?y) \models Grasp(?x ?y) (f) Closed(?x)$

Thus the representation is a very expressive and compact notation for describing fairly subtle distinctions between situations that may occur.

Temporal semantics are needed to correctly report the occurrences of the events. For example, the *Puton* event is described using

$Puton(?x ?y ?z) \models Pickup(?x ?y) (m) Moveholding(?x ?y) \wedge Moveholding(?x ?y) (sb) On(?y ?z)$

Puton will become true only when the *On* predicate becomes true. But the action definition of *Puton* is the period during which the block was being put on the other block. We therefore attribute Abstraction semantics to the *Puton* event which means that the set α for this event will include the instant at which the earliest primitive event that triggered any event participating in the assertion above i.e. the set $\{Inst.2 Inst.3 Inst.4\}$. Even though the *Puton* predicate will continue to be true for as long as the *On* predicate is true, the action definition set will include only these instants which is the correct interpretation.

Similarly in the above example, *Pick-up* is assigned Instantaneous semantics and *Move-holding* is assigned Durational semantics. *Pick-up* is defined as

$Pick-up(?x ?y) \models Grasp(?x ?y) sb Move-up(?x)$

The definition for *Move-holding* is also similar.

7. Results & Discussion

The representation language for events is a subset of the first order predicate calculus, which is a language with known expressive adequacy [Moore'82]. Situational descriptions are naturally expressed in the state based representation. Since temporal reasoning is performed using an interval based logic, efficient temporal abstraction is also facilitated. Moreover, since we have integrated state based and interval based representations, we can use the advantages of both. The major advantage of interval based logic is that it can handle imprecise temporal information elegantly. Given a set of statements about the temporal relationship of events, the inference procedures of [Allen'83] or [Villain'82] can be used derive some implicit information in these statements. Although we do not use such procedures in our system, our derived events are created using precisely the assertions of the form that the interval logic uses. So, in deriving higher level descriptions, MUSE could very well take as its input expressions generated by a system such as Allen's. Unlike these systems however, MUSE has the additional capability of automatically deriving the temporal information from purely situational descriptions. The system was specifically designed to operate in an on-line environment and it can handle on-going or partially defined events.

There are many areas where temporal reasoning needs to be performed even before the derived events are completed. For example, in system breakdown evaluation, the events leading up to the breakdown have already started much before the actual breakdown occurs. In analysing opponent strategies, it is necessary to analyse events as they happen. In fact all temporal reasoning about the present time involves abstracting some high-level events which are yet to be completed. By using the features of state based temporal logic systems, our representation scheme can deal with situations involving incomplete events, while retaining the abstraction facilities of the interval based systems. Thus we feel that this work addresses a significant issue in temporal knowledge representation and temporal reasoning.

8. Bibliography

- [Allen'84] Allen, J. "Towards a General Model of Action and Time", *Artificial Intelligence*, 23, 2, July 1984.
- [Allen'85] Allen, J. and Hayes, P. "A Common Sense Theory of Time", *Proc. of the Ninth International Joint Conference on Artificial Intelligence*, Los Angeles, Ca, 1985.
- [Borchardt'85] Borchardt, G. "Event Calculus", *Proc. of the Ninth International Joint Conference on Artificial Intelligence*, Los Angeles, Ca, 1985.
- [Brahman'83] Brahman, R. "What ISA is and isn't: An analysis of the Taxonomic Links in a Semantic Network", *IEEE Computer, Special Issue on Knowledge Representation*, September, 1983.
- [Kumar & Mukerjee'87] Kumar, K. and Mukerjee, A. "Temporal Event Conceptualization", Technical Report TAMU DCS 87-003, Department of Computer Science, Texas A&M University, Tx, 1987.
- [Ladner'86] Ladner, P. "Time Representation: A Taxonomy of Interval Relations", *Proceedings of the AAAI-86*, Philadelphia, 1986.
- [McDermott'82] McDermott, D. "A Temporal Logic for Reasoning About Processes and Plans", *Cognitive Science* 6, 1982.
- [Miller & Johnson-Laird'75] Miller, G.A. and Johnson-Laird, P.N. "Language and Perception", Harvard University Press, Ma, 1975.
- [Moore'82] Moore, R.C. "The Role of Logic in Knowledge Representation and Common Sense Reasoning", *Proc. of the AAAI-82*, Pittsburgh, Pa 1982, pp (428-433).
- [Nowtson'73] Nowtson, D. "Attribution and the unit of perception of behaviour", *Journal of Personality and Social Psychology*, 28, 1973.
- [Schmidt, Sridharan & Goodson'78] Schmidt, C., Sridharan, N.S., Goodson, J.L. "The plan recognition problem: An intersection of Psychology and Artificial Intelligence" *Artificial Intelligence*, 11, 1978.
- [Thibadeau'86] Thibadeau, R. "Artificial Perception of Actions", *Cognitive Science* (10), 1986, 117-149.
- [Tsuiji'77] Tsuiji, S. "Understanding a simple Cartoon Film by a Computer Vision System", in *Proc. of the Fifth International Joint Conference on Artificial Intelligence*, Cambridge, Ma, 1977.
- [Villain'82] Villain, M. "A system for reasoning about time", *Proc. of AAAI-82*, Pittsburgh, Pa, 1982, pp (832-843).
- [Wilensky'83] Wilensky, R. "Planning and Understanding", Addison-Wesley Publications, Advanced Book Program, Reading, Mass. 1983.