

# Intelligent Systems: Reasoning and Recognition

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## Temporal Reasoning with Interval Relations

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Background Reading:

James F. Allen: Maintaining knowledge about temporal intervals. In: Communications of the ACM. 26 November 1983. ACM Press. pp. 832–843

## Temporal Logic

The system of Temporal Logic proposed by James Allen (Allen 83) provides a simple and practical method for reasoning about the temporal relations between events. The system provides an illustration of the role of relations in reasoning and in structured knowledge representation.

Temporal Logic is designed to express knowledge about temporal relations in a manner that

- 1) Permits expression of relations that are relative and imprecise.
- 2) Permits expression and reasoning about uncertainty about the temporal relations between events.
- 3) Supports reasoning at variable scales of time.
- 4) Supports persistence

Allen's temporal logic is based on representing events as intervals of time.

Time: an ordering relation on an infinite set of points.

The temporal axis is infinitely dense. Between any two points lies a point.

Interval: An ordered set of points  $T = \{t\}$  defined by "end-points"  $t^-$  and  $t^+$   
 $(t^-, t^+)$ :  $(\forall t \in T) (t > t^-) \text{ and } (t < t^+)$

This could be written:  $]t^-, t^+[$  - The endpoints are not part of the interval.

(Note that this is a minor detail for using the logic).

For intervals defined in this way, there are 13 possible relations between any pair of intervals. Of these 13 relations, 7 are basic, 6 are inverse relations.

The set of 7 basic relations includes "equals", which is its own inverse.

Temporal relations make it possible to reason about time without knowing the actual time of events. The actual values of  $(t^-, t^+)$  are NOT used.

This system is essentially a calculus of interval relations that can be generalized to multiple dimensions for reasoning about spatial relations and any other phenomena that can be represented by intervals or regions.

## Temporal Reasoning with Intervals

### Temporal relations

For the intervals  $t$  and  $s$ , the 7 basic relations are:

Name	Notation	Schema	Definition	Inverse Name	Inverse Symbol
equal	$t=s$	$ t^- $ $ s^- $	$(t^- = s^-) \wedge (t^+ = s^+)$		
before	$t < s$ or $(t \text{ b } s)$	$ t^- $ $ s^- $	$t^+ < s^-$	after	$s > t$ or $(s \text{ a } t)$
overlap	$t \text{ o } s$	$ t^- $ $ s^- $	$(t^- < s^-) \wedge (t^+ > s^-) \wedge (t^+ < s^+)$	overlapped by	$s \text{ oi } t$
meets	$t \text{ m } s$	$ t^- $ $ s^- $	$t^+ = s^-$	met by	$s \text{ mi } t$
during	$t \text{ d } s$	$ t^- $ $ ---s--- $	$(t^- > s^-) \wedge (t^+ < s^+)$	contains	$s \text{ di } t$
starts	$t \text{ s } s$	$ t^- $ $ ---s--- $	$(t^- = s^-) \wedge (t^+ < s^+)$	started by	$s \text{ si } t$
finishes	$t \text{ f } s$	$ t^- $ $ ---s--- $	$(t^- > s^-) \wedge (t^+ = s^+)$	finished by	$s \text{ fi } t$

Uncertainty in the relative time of two events is represented by listing the possible set of relations between the events.

The set of possible relations between two intervals are represented by a labeled pointer. The label is the set of possible relations.

Whenever a relation is asserted, its inverse is also asserted.

Relations are represented as a labeled arrow: For example, for intervals  $A, B$ :

$$A \xrightarrow{\{R_{AB}\}} B$$

For example: of  $A \xrightarrow{\{<\}} B$  or  $A \xrightarrow{\{o\}} B$  or  $A \xrightarrow{\{m\}} B$   
then  $A \xrightarrow{\{< o m\}} B$

Initially all relations are possible (total uncertainty).

As relations are asserted between intervals, they impose constraints on other relations.

## Temporal Reasoning with Intervals

For example

$$A \text{ -----}\{d\}\text{-----} > B \text{ -----}\{>, o\}\text{-----} > C$$

Then it must be that  $R_{AC} = \text{Transitivity}(d, >) \cup \text{Transitivity}(d, o)$

$$R_{AC} = \{>\} \cup \{< o m d s\} = \{> < o m d s\}$$

When a new relation is asserted between two intervals, it places constraints on all other relations.

For example, if we discover that  $A \text{ ---}\{>\}\text{---} > C$

then we can infer that  $R_{BC} = \{< o m d s\}$

How?

$$R_{AC} = \{>\} \Rightarrow R_{CA} = \{<\}$$

then

$$R_{BC} = \text{Transitivity}\{R_{CA}, R_{AB}\} = T(<, d) = \{< o m d s\}$$

A table of transitivity determines constraints between relations

# Temporal Reasoning with Intervals

## Table of Transitivity

Transitivity is determined by a 12x12 table of transitive relations.  
 (why 12 and not 13? Ans: "=" is idempotent (i.e. it's own inverse.))

B r2 C	<	>	d	di	o	oi	m	mi	s	si	f	fi
A r1 B												
"before" <	<	no info	< o m d s	<	<	< o m d s	<	< o m d s	<	<	< o m d s	<
"after" >	no info	>	> oi mi d f	>	> oi mi d f	>	> oi mi d f	>	> oi mi d f	>	>	>
"during" d	<	>	d	no info	< o m d s	> oi mi d f	<	>	d	> oi mi d f	d	< o m d s
"contains" di	< o m di fi	> oi di mi si	o oi dur con =	di	o di fi	oi di si	o di fi	oi di si	di fi o	di	di si oi	di
"overlaps" o	<	> oi di mi si	o d s	< o m di fi	< o m	o oi dur con =	<	oi di si	o	di fi o	d s o	< o m
"over-lapped-by" oi	< o m di fi	>	oi d f	> oi mi di si	o oi dur con =	> oi mi	o di fi	>	oi d f	oi > mi	oi	oi di si
"meets" m	<	> oi mi di si	o d s	<	<	o d s	<	f fi =	m	m	d s o	<
"met-by" mi	< o m di fi	>	oi d f	>	oi d f	>	s si =	>	d f oi	>	mi	mi
"starts" s	<	>	d	< o m di fi	< o m	oi d f	<	mi	s	s si =	d	< m o
"started by" si	< o m di fi	>	oi d f	di	o di fi	oi	o di fi	mi	s si =	si	oi	di
"finishes" f	<	>	d	> oi mi di si	o d s	> oi mi	m	>	d	> oi mi	f	f fi =
"finished-by" fi	<	> oi mi di si	o d s	di	o	oi di si	m	si oi di	o	di	f fi =	fi

Copied from Davis, E. "Representations of commonsense knowledge", p514, Morgan Kaufmann, 2014.

## Temporal Reasoning with Intervals

For example : for  $(A < B)$  et  $(B ? C)$

	<u>(B ? C)</u>	<u>Constraint on (B ? C)</u>
$(A < B)$	$(B < C)$	{<}
$(A < B)$	$(B > C)$	No Info
$(A < B)$	$(B \underline{d} C)$	{< <u>o m d s</u> }
$(A < B)$	$(B \underline{di} C)$	{<}
$(A < B)$	$(B \underline{o} C)$	{<}
$(A < B)$	$(B \underline{oi} C)$	{< <u>o m d s</u> }
$(A < B)$	$(B \underline{m} C)$	{<}
$(A < B)$	$(B \underline{mi} C)$	{< <u>o m d s</u> }
$(A < B)$	$(B \underline{s} C)$	{<}
$(A < B)$	$(B \underline{si} C)$	{<}
$(A < B)$	$(B \underline{f} C)$	{< <u>o m d s</u> }
$(A < B)$	$(B \underline{fi} C)$	{<}

The transitivity table is used to develop the set of possible relations between each pair of intervals.

Given  $A \xrightarrow{\{R_{AB}\}} B \xrightarrow{\{R_{BC}\}} C$

Possible Relations for  $A \xrightarrow{\{R_{AC}\}} C$  are give by  $R_{AC} = \text{Transitivity}(R_{AB}, R_{BC})$

Transitivity  $(R_{AB}, R_{BC})$

$R_{AC} \leftarrow \text{NIL};$

$\forall r_{ab} \in R_{AB}$

$\quad \forall r_b \in R_{BC}$

$\quad R_{AC} := R_{AC} \cup T(r_{ab}, r_{BC});$

RETURN  $R_{AC};$

**Constraint Propagation**

When a new relation is asserted for two intervals A, B

This new set of relations then imposes constraints on all other relations in the network.

$$\text{Given } A \xrightarrow{\{R_{AB}\}} B \xrightarrow{\{R_{BC}\}} C \\ \wedge \text{-----} \{ R_{AC}^B \} \text{-----} \wedge$$

however

$$\text{Given } A \xrightarrow{\{R_{AD}\}} D \xrightarrow{\{R_{DC}\}} C \\ \wedge \text{-----} \{ R_{AC}^D \} \text{-----} \wedge$$

Then  $R_{AC} = R_{AC}^B \cap R_{AC}^D$

It is necessary to propagate constraints for the entire network.

Propagate (interval A)

$\forall$  interval i

$\forall$  interval j

$$R_{Ai} := R_{Ai} \cap \text{Transitivity}(R_{Aj}, R_{ji});$$

There are  $(N-1)^2/2$  pairs of intervals.

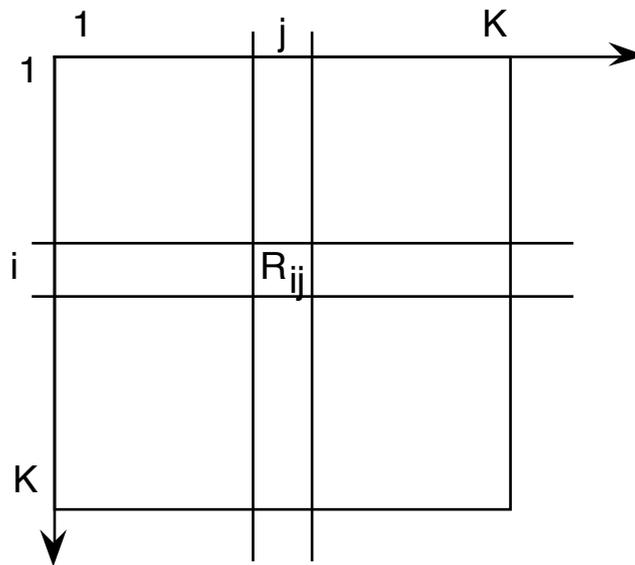
The algorithmic complexity for N intervals is  $O(N^2)$  operations.

Whenever a new relation is asserted, the constraints propagate through the network.

For N intervals, we can see the network as a N x N table of relations

Each new entry requires visiting all cells in the table  $O(N^2)$  operations.

## Temporal Reasoning with Intervals



For example; if we assert that the possible relations between A and B are the list  $NewR_{AB}$ , then we replace  $R_{AB}$  by  $NewR_{AB}$ .

This can cause a problem as the set of intervals grows.

To avoid a combinatoric explosion, Allen proposed to group sets of relations into reference intervals. Constraints are propagated only between the intervals within the same reference.

for example : Hour, Day, Week, Month and Year are all reference intervals.

## Temporal Reasoning with Intervals

### Reference Intervals.

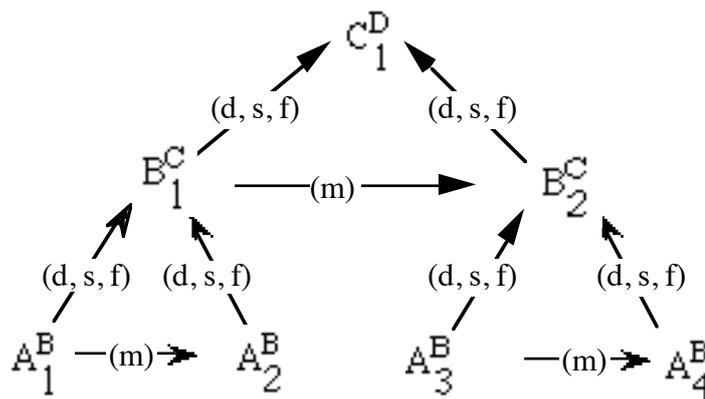
A reference interval is a set of intervals with a complete graph of temporal relations between them.

No explicit relations are made with intervals outside the reference. Instead, the network of relations between the references is used to determine relations when needed.

Reference intervals form a hierarchy.

Notation :  $A_k^B$  : Interval  $A_k$  for the reference  $B$ .

Example :



If two intervals are not directly related, then their relations are determined by ascending the tree.

## **Example Problem in Temporal Reasoning**

Assume the following temporal relations between intervals A, B, C and D.

Event A is before B:           (A < B)

Event B during C:           (B d C)

Event D is before A:       (D < A)

Event D meets C:           (D m C)

- a) What are the possible relations of A to C obtained by transitivity with B?
- b) What are the possible relations of A to C obtained by transitivity with D?
- c) What are the possible relations of A to C after constraint propagation?

## Temporal Reasoning with Intervals

### ANSWERS

a) What are the possible relations of A to C obtained by transitivity with B?

$$T(A < B, B \underline{d} C) = \{<, \underline{o}, \underline{m}, \underline{d}, \underline{s}\}$$

b) What are the possible relations of A to C obtained by transitivity with D?

$$(D < A) \Rightarrow (A > D)$$

$$T(A > D, D \underline{m} C) = \{>, \underline{io}, \underline{mi}, \underline{d}, \underline{f}\}$$

c) What are the possible relations of A to C after constraint propagation?

$$(A \underline{d} C)$$